
Seamless seasonal-to-decadal prediction with EC-Earth

F. J. Doblas-Reyes, ICREA & IC3, Barcelona, Spain

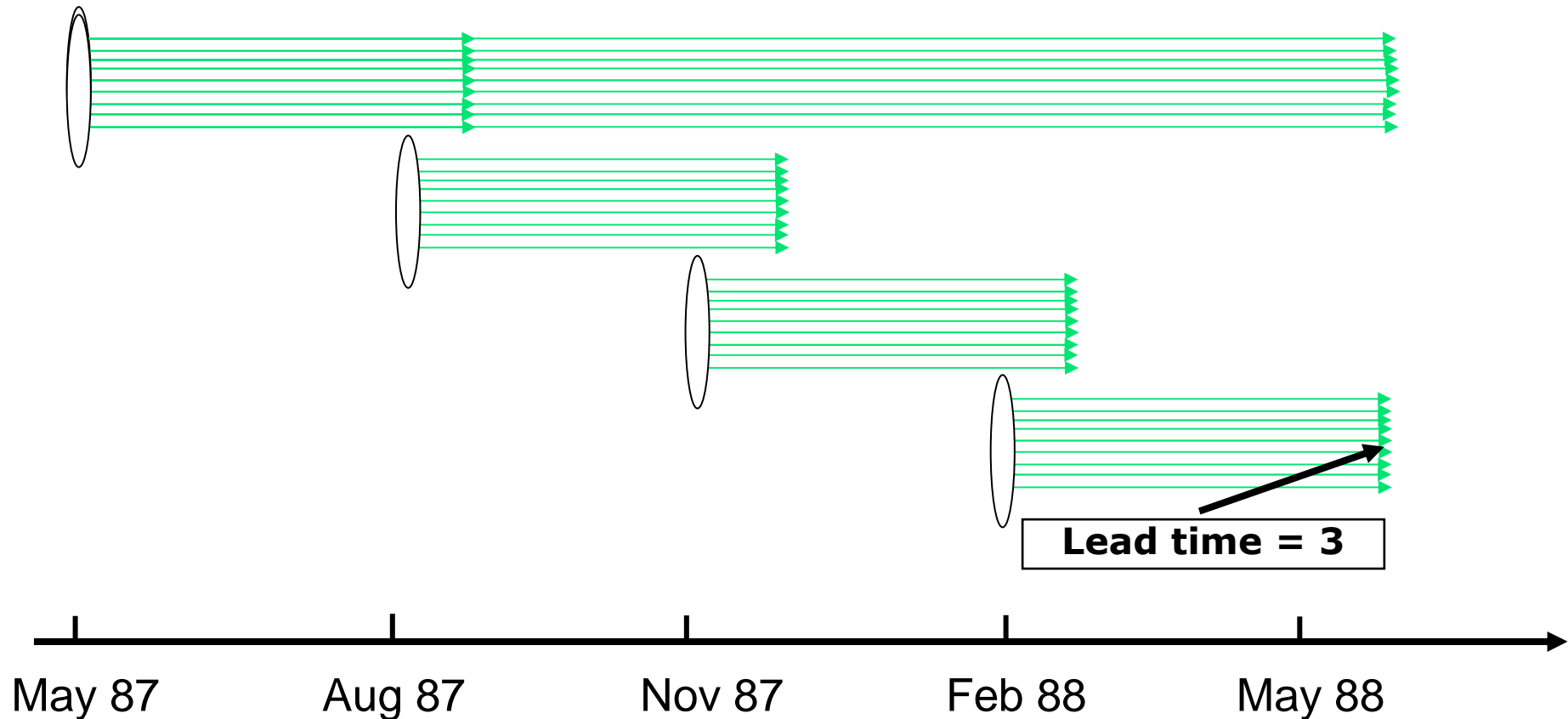
with contributions from IC3's CFU group and Bert Wouters
(KNMI)

Outline

- Dynamical seasonal forecasting: systematic errors
- Seasonal forecasting, the first few months
- Seasonal forecasting beyond a few months
- Forecasting beyond the first year: comparison with other systems
- Global-average temperature and trends
- Summary

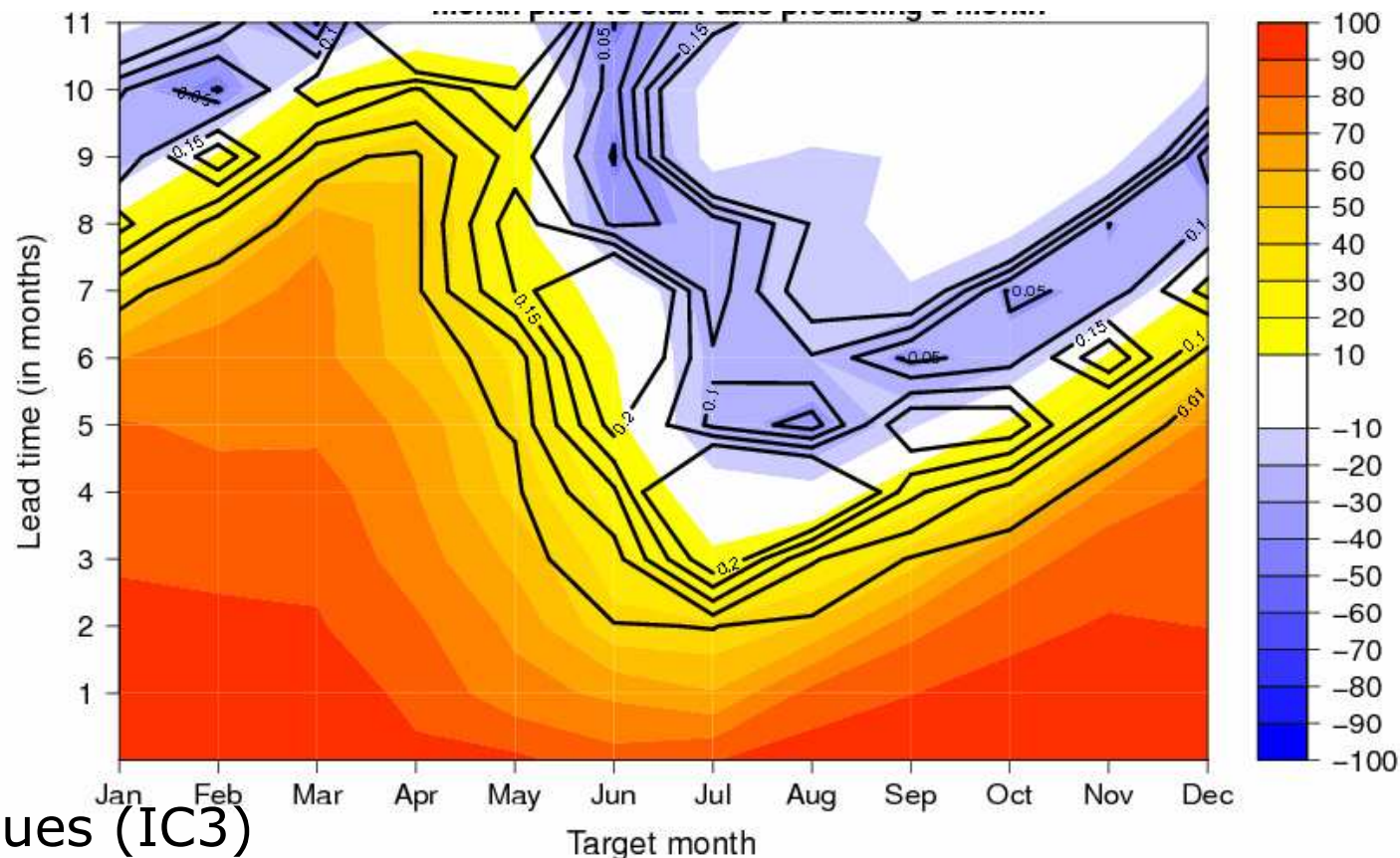
Ensemble climate forecast systems

Assume an ensemble forecast system with coupled initialized GCMs



Simple empirical model: persistence

Correlation (solid line p value) of a Niño3.4 persistence model based on lagged linear regression of HadISST over 1981-2009; first regression model with data for 1951-1980.



L. Rodrigues (IC3)

Seasonal forecast experimental setup

- Two forecast systems: System 3 (IFS/HOPE) and EC-Earth v2.2 (IFS/NEMO)
- Initial conditions: ERA40/ERAInt atmosphere and land, ORA-S3 and NEMOVAR-COMBINE ocean, DFS4.3 sea ice
- Five-member ensemble hindcasts up to 7 months
- Ensemble from five-member ocean analysis and atmospheric perturbations (singular vectors, plus SST perturbations in System 3) added to each member
- Initial conditions valid for 0 GMT on the 1st of a month
- Four start dates per year: Feb, May, Aug and Nov.
- Forecast period 1981-2005

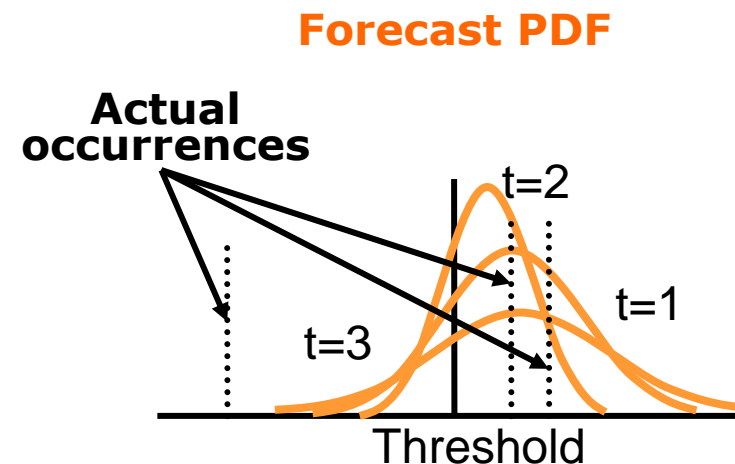
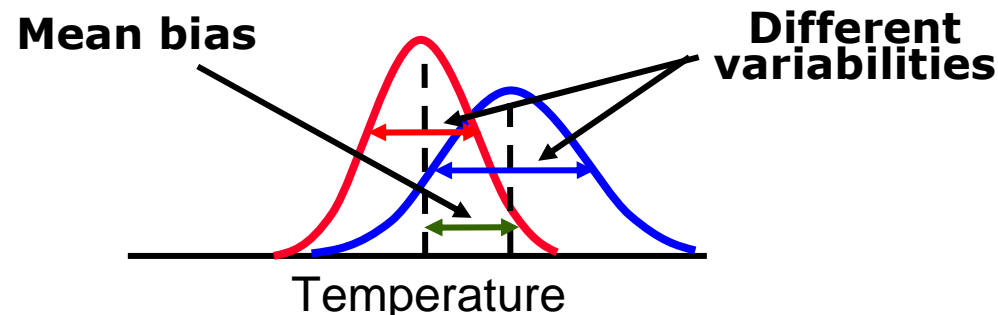
Systematic errors in ensemble forecasts

Main systematic errors in dynamical climate forecasts:

- o Differences between the model climatological pdf (computed for a lead time from all start dates and ensemble members) and the reference climatological pdf (for the corresponding times of the reference dataset): systematic errors in mean and variability.
- o Conditional biases in the forecast pdf: errors in conditional probabilities implying that probability forecasts are not trustworthy. This type of systematic error is best assessed using the reliability diagram.

Differences in climatological pdfs

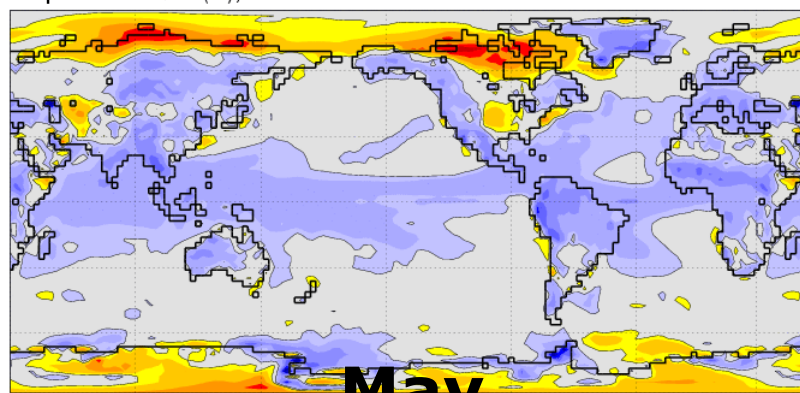
Reference pdf Model pdf



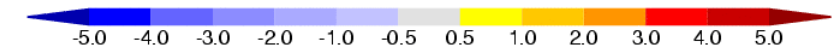
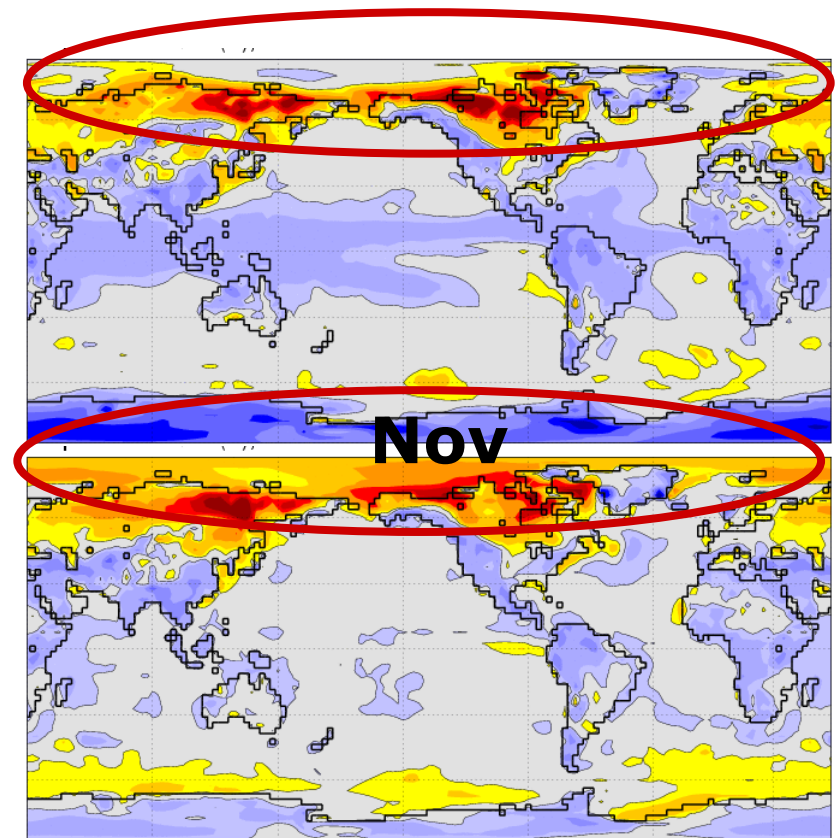
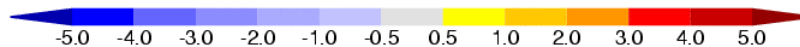
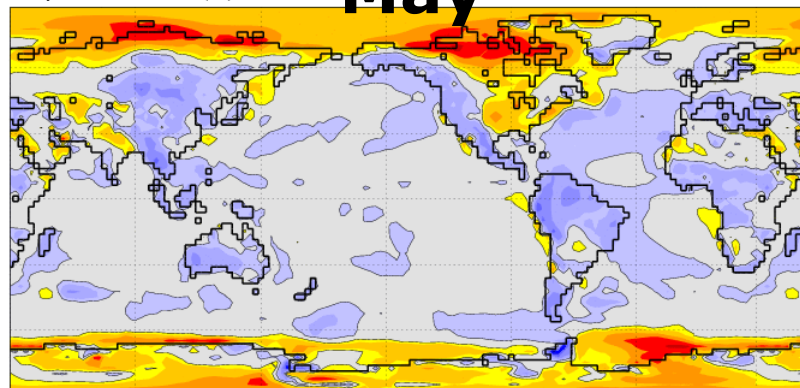
Seasonal predictions: mean bias

Bias of first month near-surface air temperature re-forecasts
wrt ERA40/Int over 1976-2005.

EC-Earth



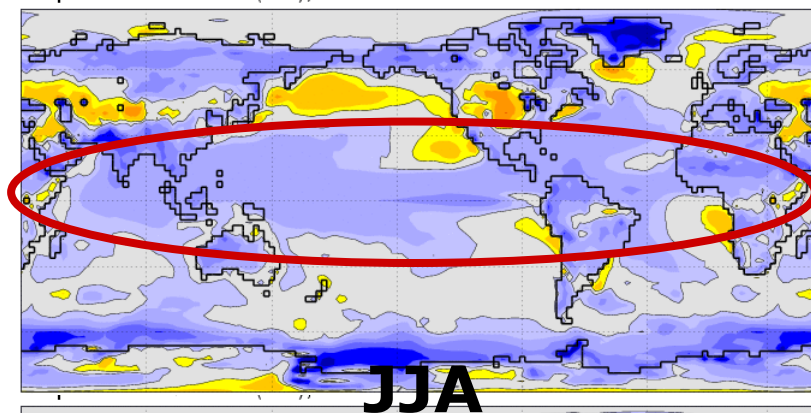
System 3



Seasonal predictions: mean bias

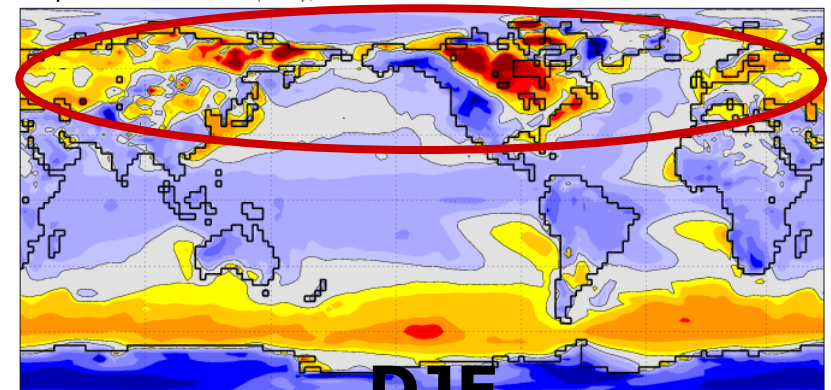
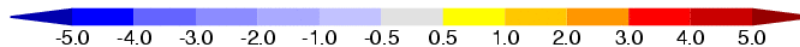
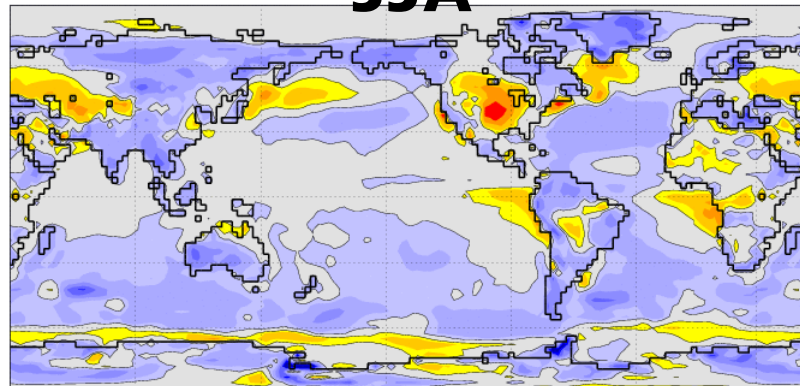
Bias of 2-4 month near-surface air temperature re-forecasts
wrt ERA40/Int over 1976-2005.

EC-Earth

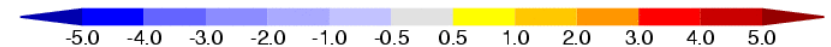
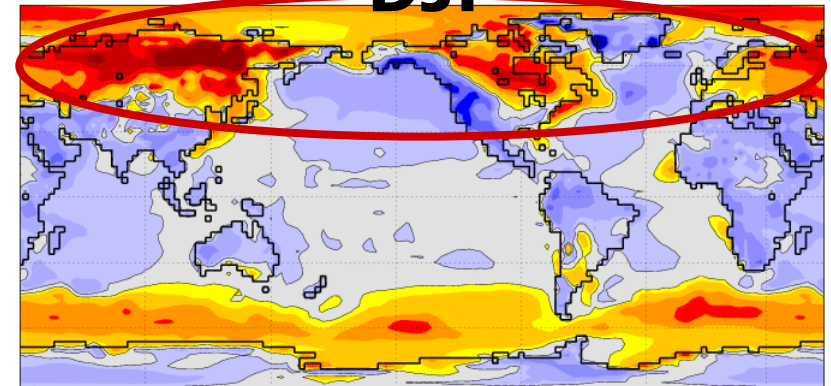


JJA

System 3



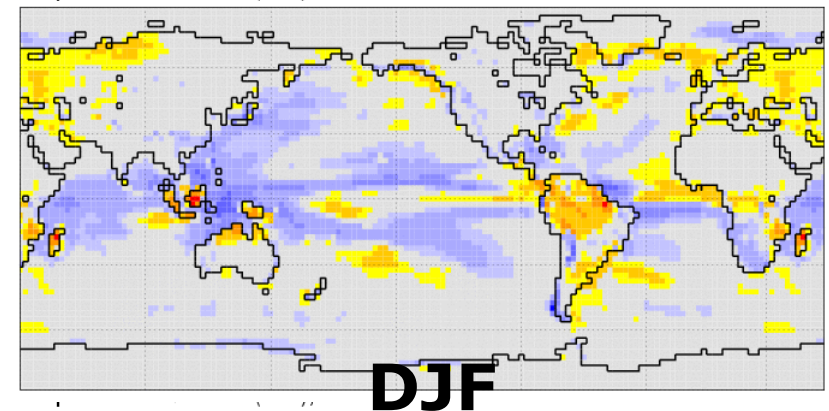
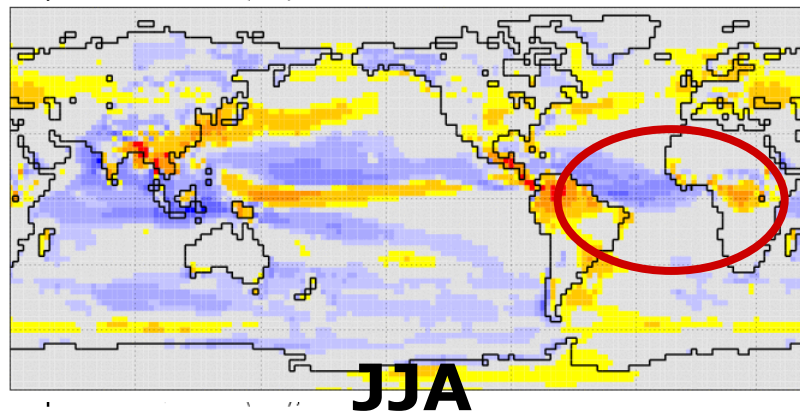
DJF



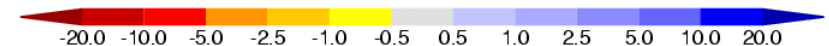
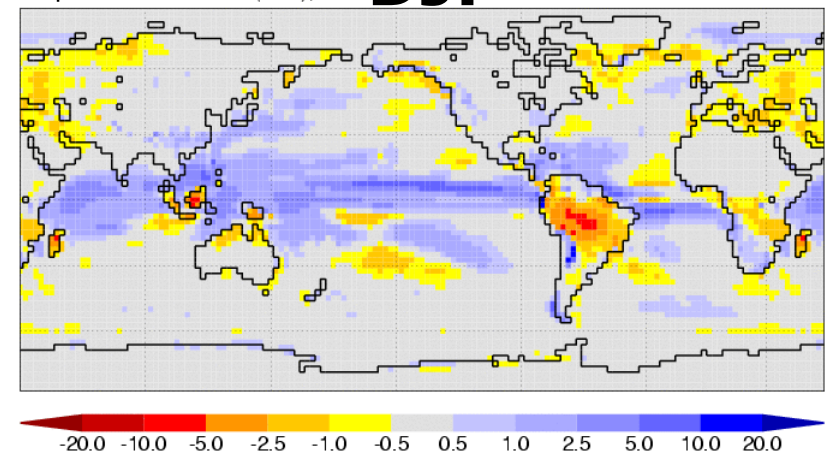
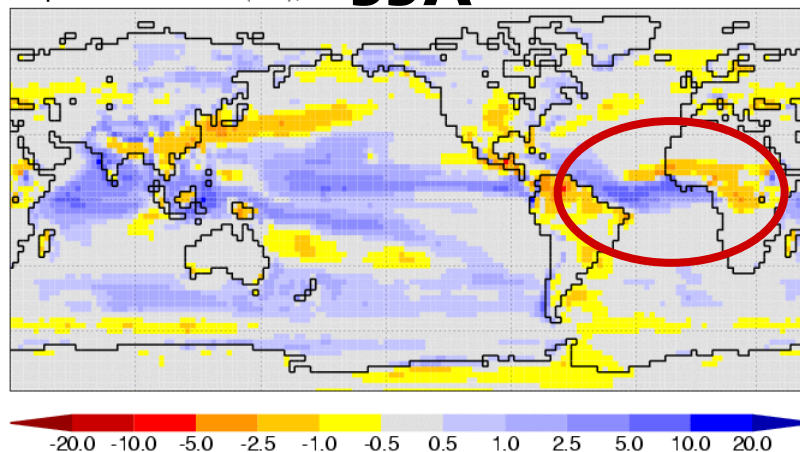
Seasonal predictions: mean bias

Bias of 2-4 month precipitation re-forecasts wrt GPCP over 1980-2005.

EC-Earth



System 3



Seasonal predictions: ENSO

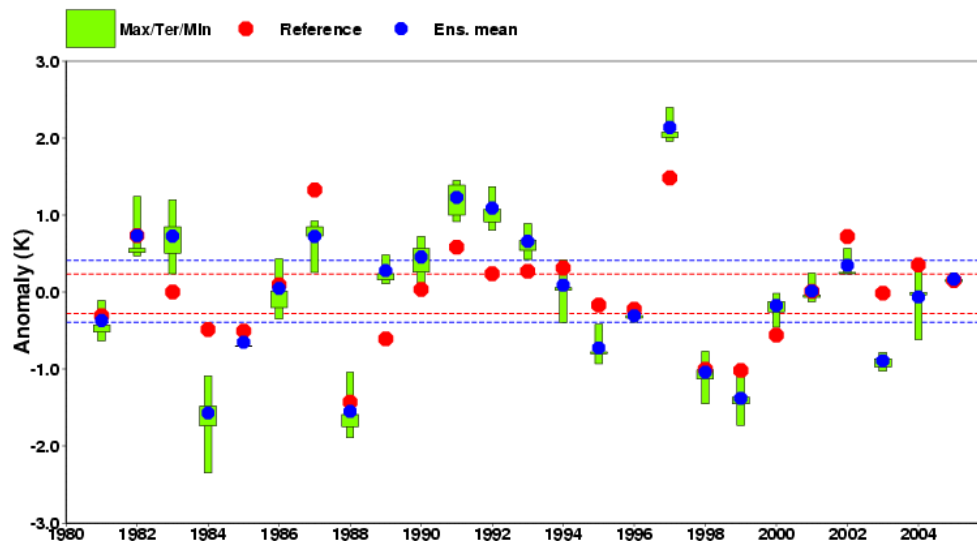
Niño3.4 time series for ERA40/Int (red dots), ensemble range (green box-and-whisker) and ensemble mean (blue dots) 2-4 month (JJA) re-forecasts over 1981-2005.

EC-Earth

Ratio sd: 1.34

Corr: 0.82

RPSSd: 0.48

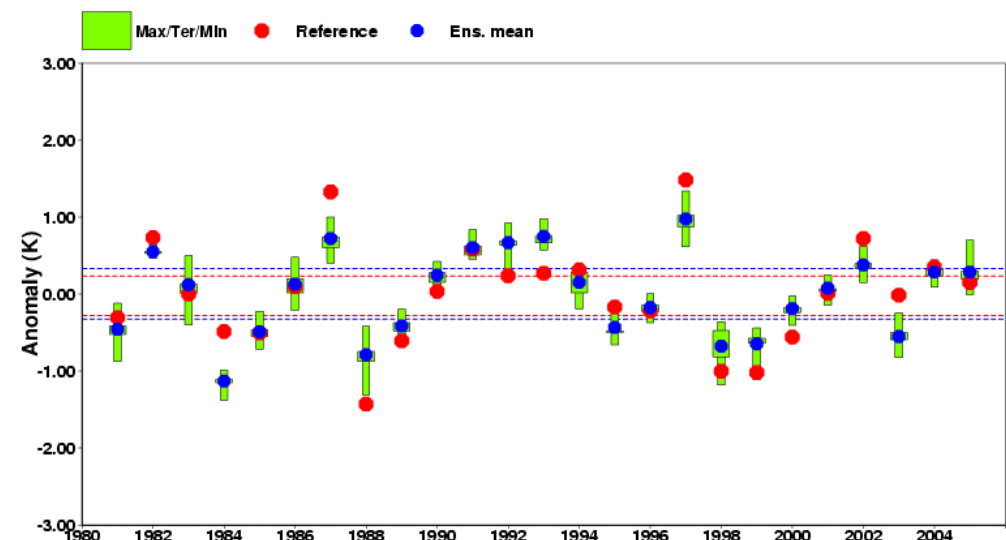


System 3

Ratio sd: 0.84

Corr: 0.86

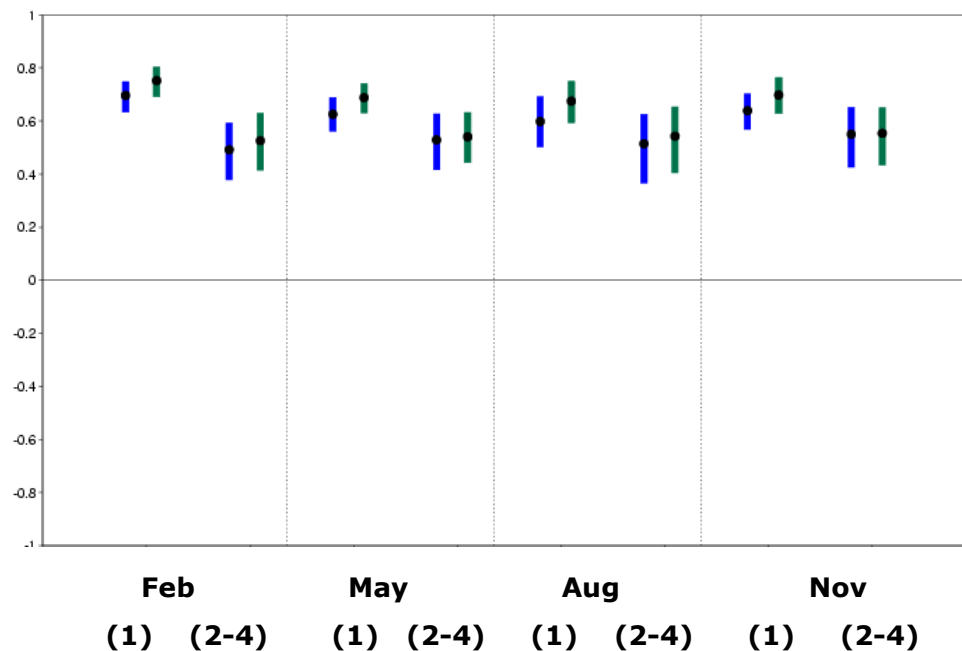
RPSSd: 0.68



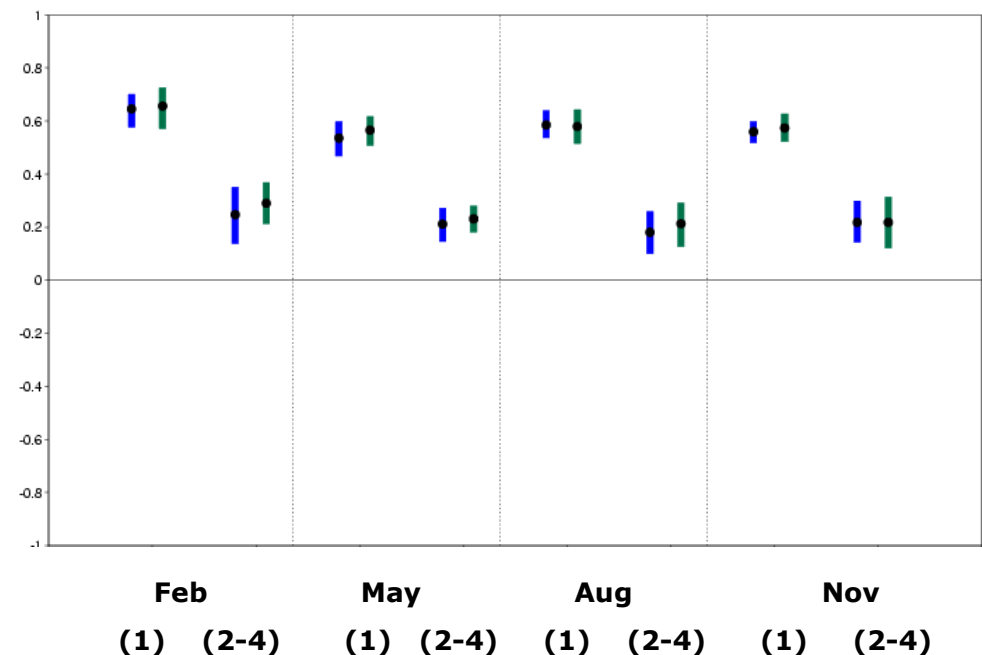
Seasonal predictions: regional skill

Anomaly correlation coefficient (and bootstrapped 95% confidence intervals) for first month and 2-4 month seasonal predictions of **EC-Earth** and **System 3** ensemble near-surface temperature wrt ERA40/Int over 1981-2005.

Tropics



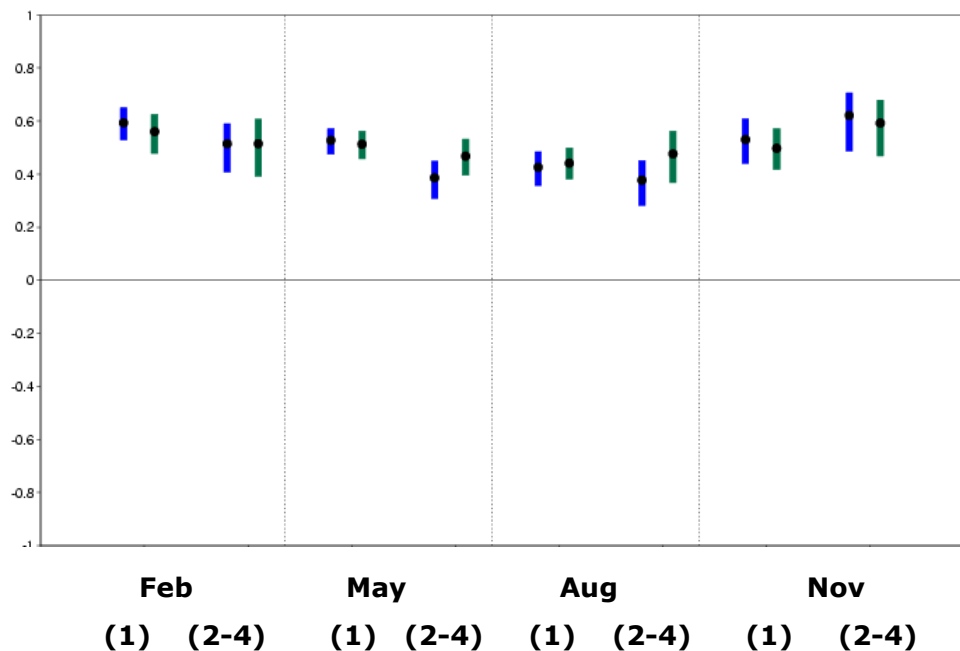
Northern Extratropics



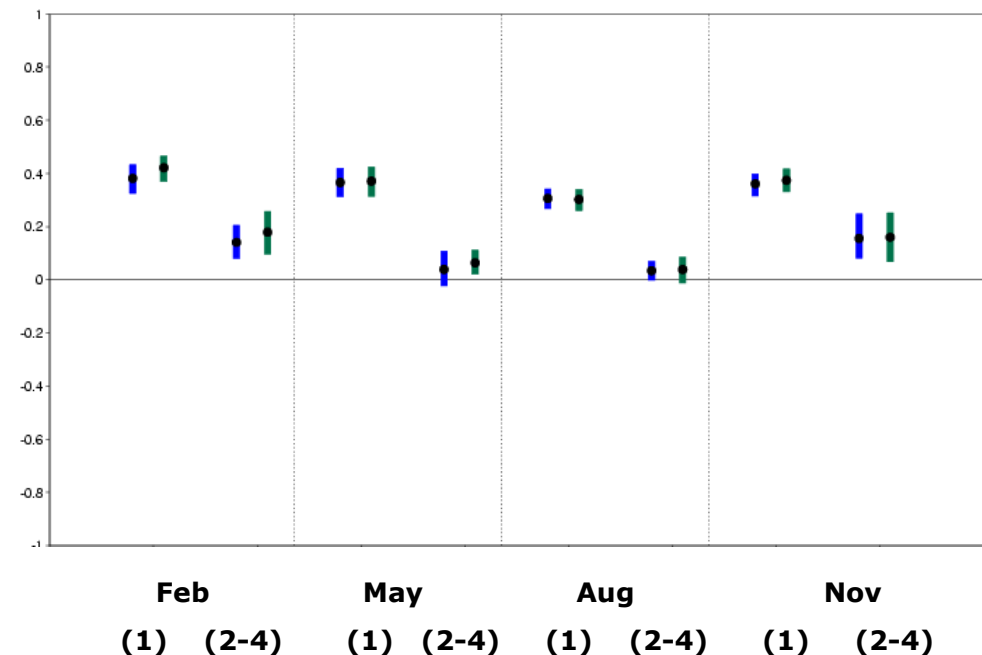
Seasonal predictions: regional skill

Anomaly correlation coefficient (and bootstrapped 95% confidence intervals) for first month and 2-4 month seasonal predictions of **EC-Earth** and **System 3** ensemble precipitation wrt GPCP over 1981-2005.

Tropics



Northern Extratropics

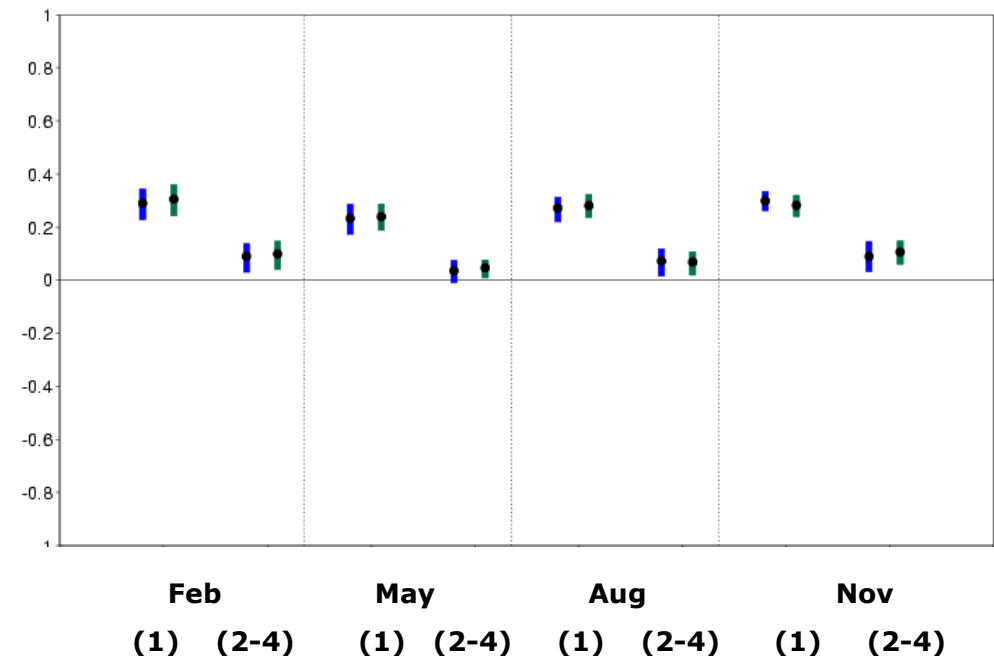
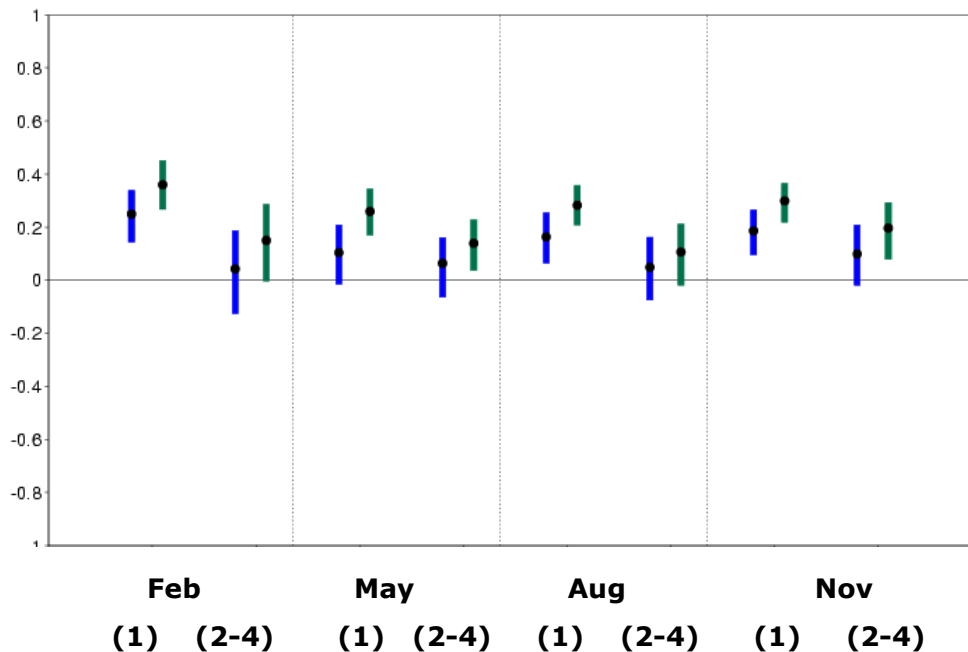


Seasonal predictions: regional skill

Infinite ensemble size Brier skill score (and bootstrapped 95% confidence intervals) for first month and 2-4 month seasonal predictions above the upper tercile of **EC-Earth** and **System 3** ensemble near-surface temperature wrt ERA40/Int over 1981-2005.

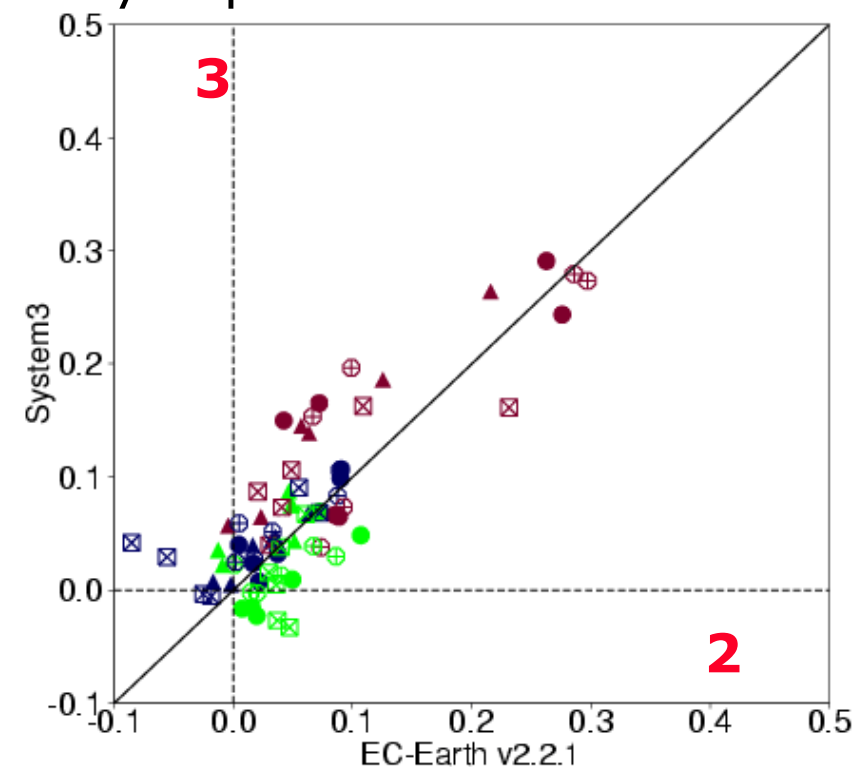
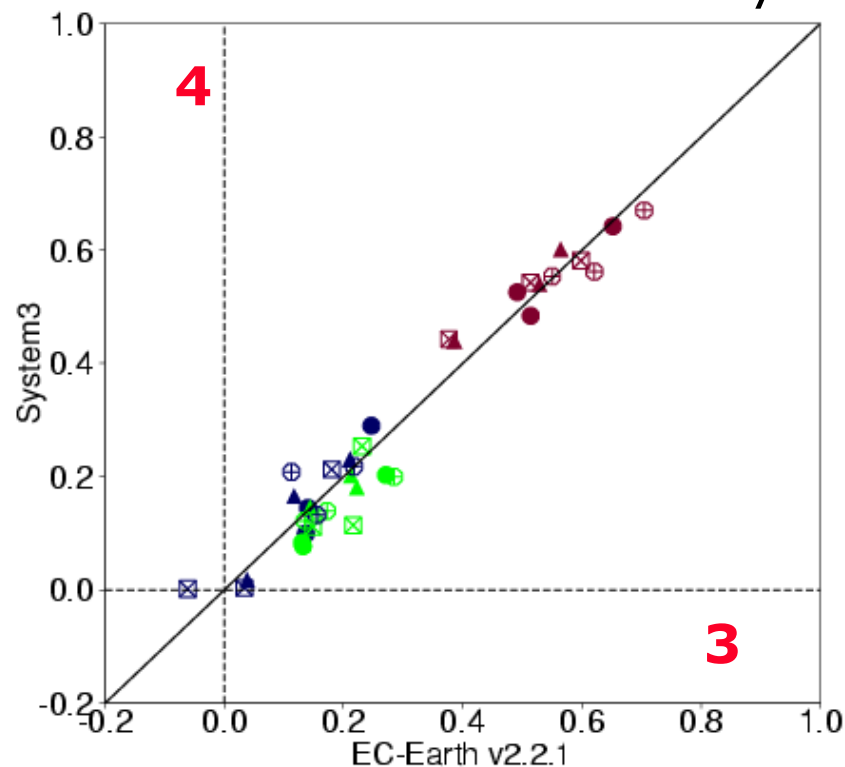
Tropics

Northern Extratropics



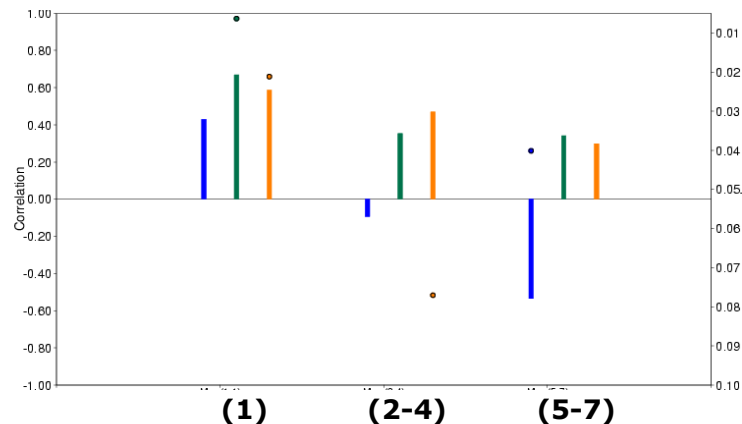
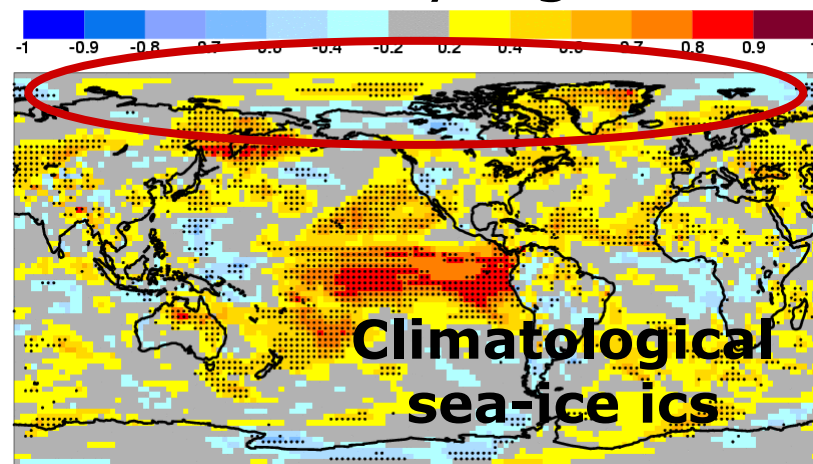
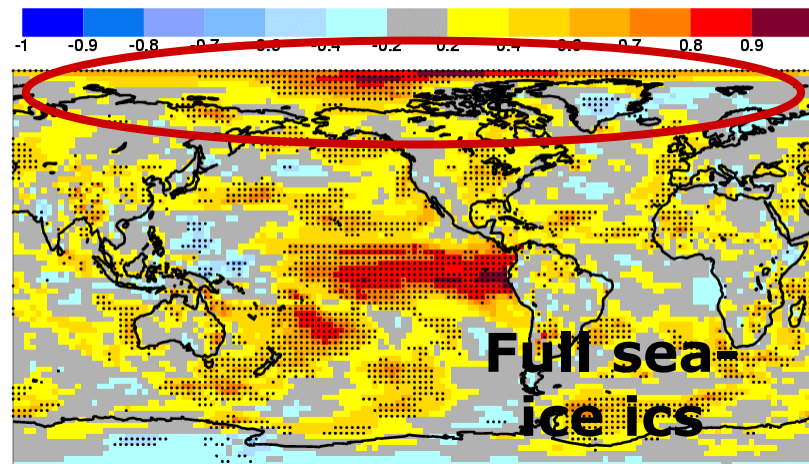
Seasonal prediction: system comparison

ACC (left) and **infinite ensemble size Brier skill score** (right) for lead time 2-4, several regions (**NH**, **Tropics**, **SH**), events (anomalies above/below the upper/lower tercile), start dates (Feb, May, Aug and Nov) and variables (near-surface temperature, precipitation and MSLP) computed over the period 1981-2005. The numbers are for the cases a system is statistically significantly superior.



Seasonal predictions: sea-ice impact

Ensemble-mean correlation of EC-Earth near-surface air temperature 5-7 month (SON) re-forecasts wrt ERA40/Int over 1991-2005. Dots for values statistically significant with



Correlation for NAO EC-Earth, System 3 and EC-Earth/clim. sea-ice ics May start date re-forecasts

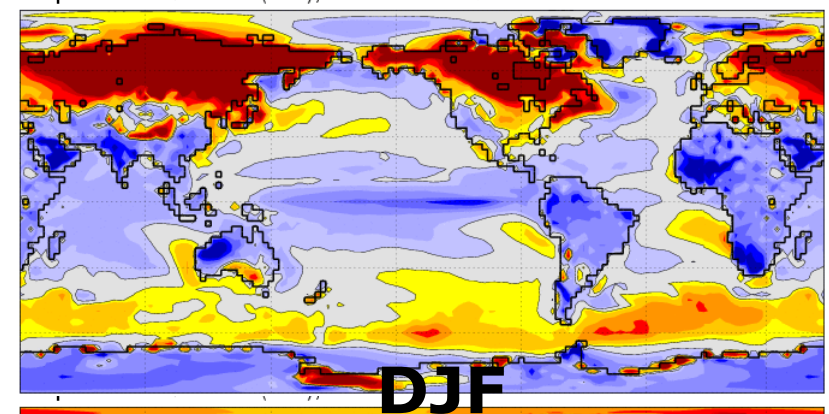
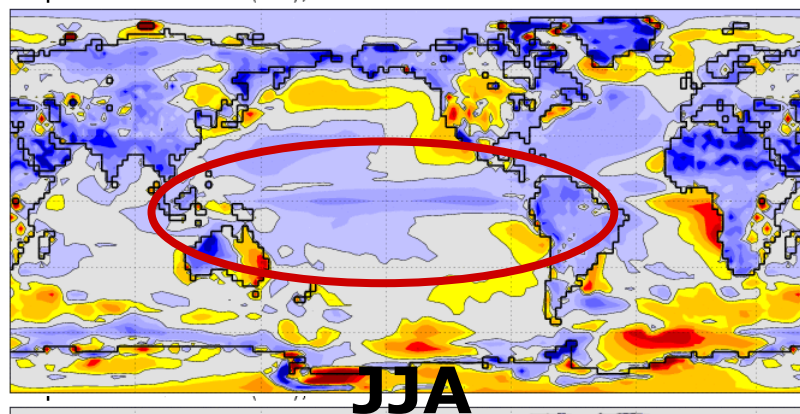
Annual forecast experimental setup

- Two forecast systems: System 3 (IFS/HOPE) and EC-Earth v2.2 (IFS/NEMO), the latter also in AMIP mode
- Initial conditions: ERA40/ERAInt atmosphere and land, ORA-S3 and NEMOVAR-COMBINE ocean, DFS4.3 sea ice
- Five-member ensemble hindcasts up to 13 months
- Ensemble from five-member ocean analysis and atmospheric perturbations (singular vectors plus SST perturbations in System 3) added to each member
- Initial conditions valid for 0 GMT on the 1st of a month
- Two start dates per year: May and November
- Forecast period 1976-2005

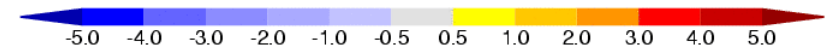
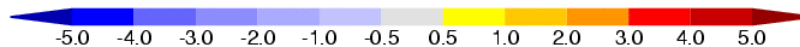
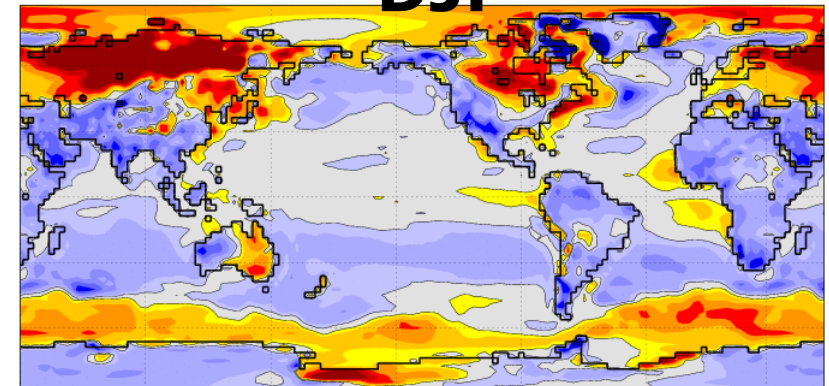
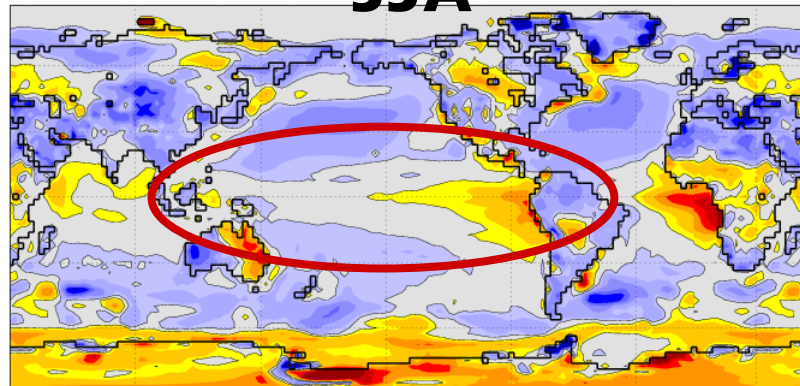
Annual predictions: mean bias

Bias of 8-10 month near-surface air temperature re-forecasts wrt ERA40/Int over 1976-2005.

EC-Earth



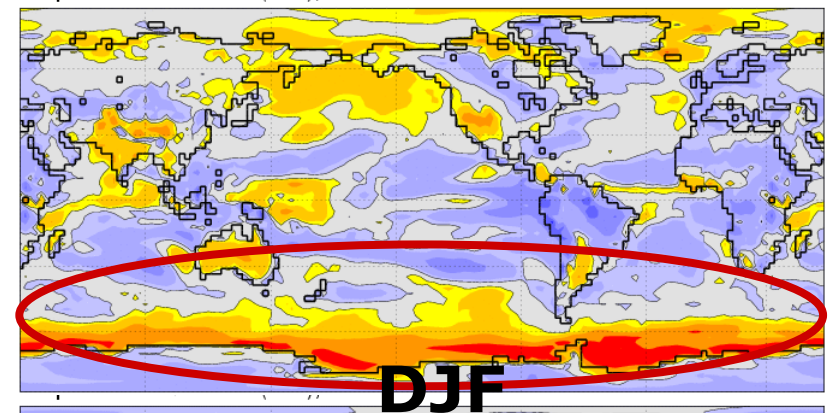
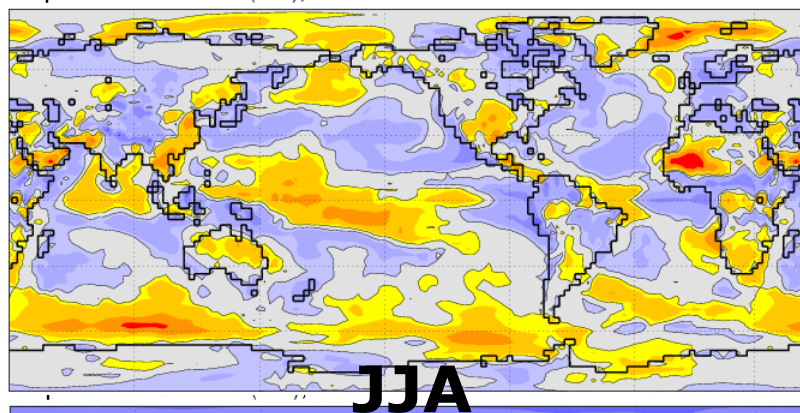
System 3



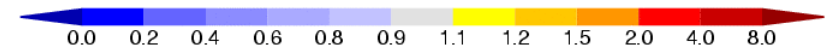
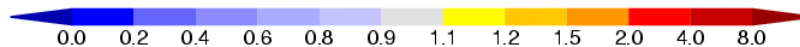
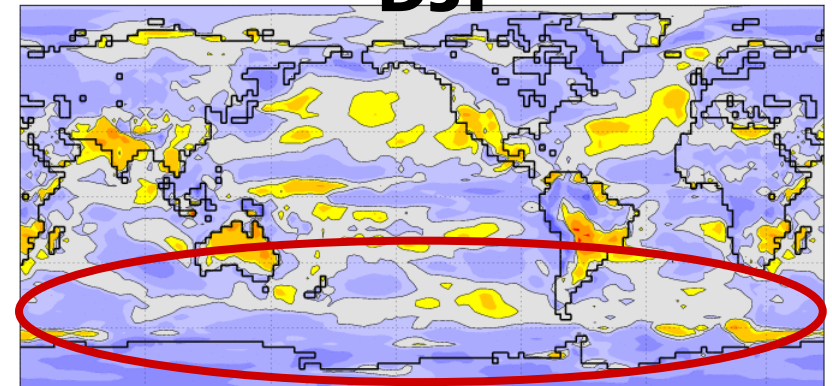
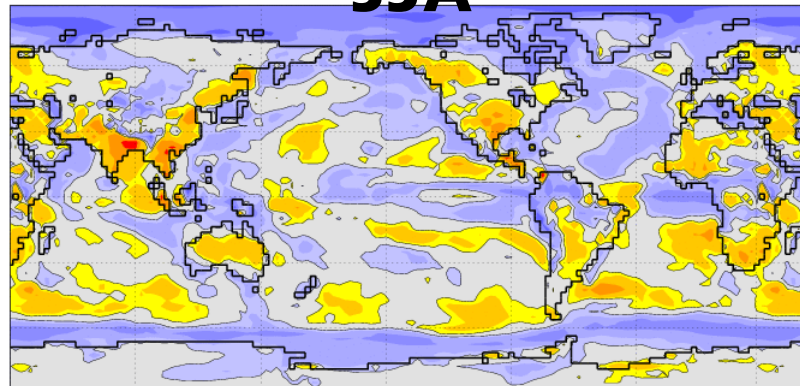
Annual predictions: standard deviation bias

Ratio of interannual standard deviation of 8-10 month near-surface air temperature re-forecasts wrt ERA40/Int over 1976-2005.

EC-Earth



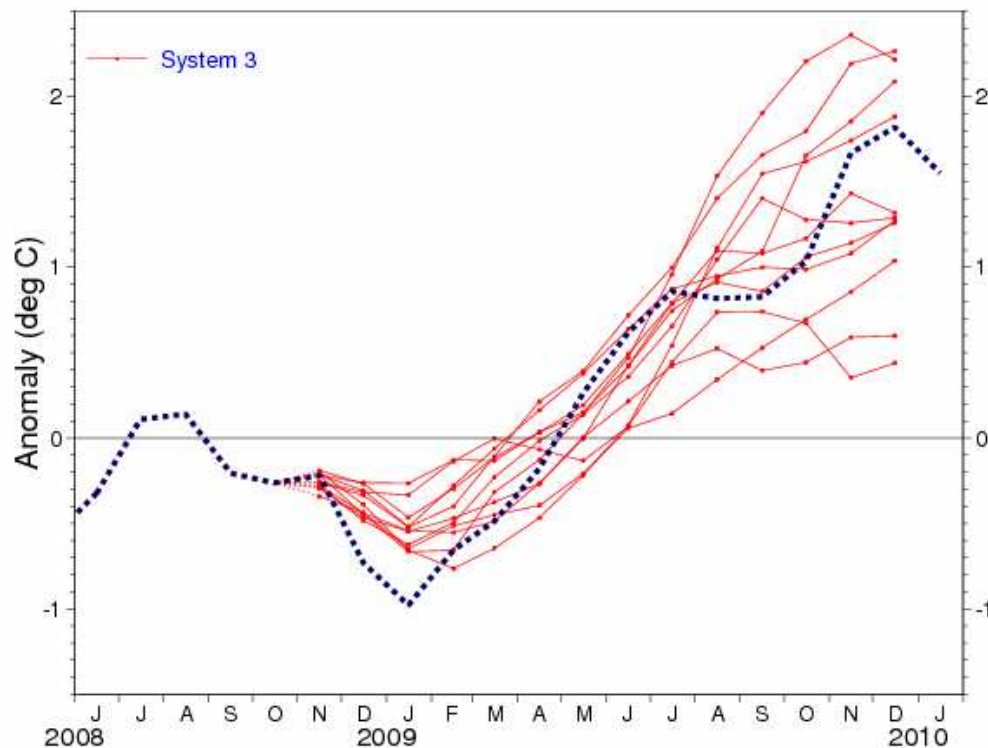
System 3



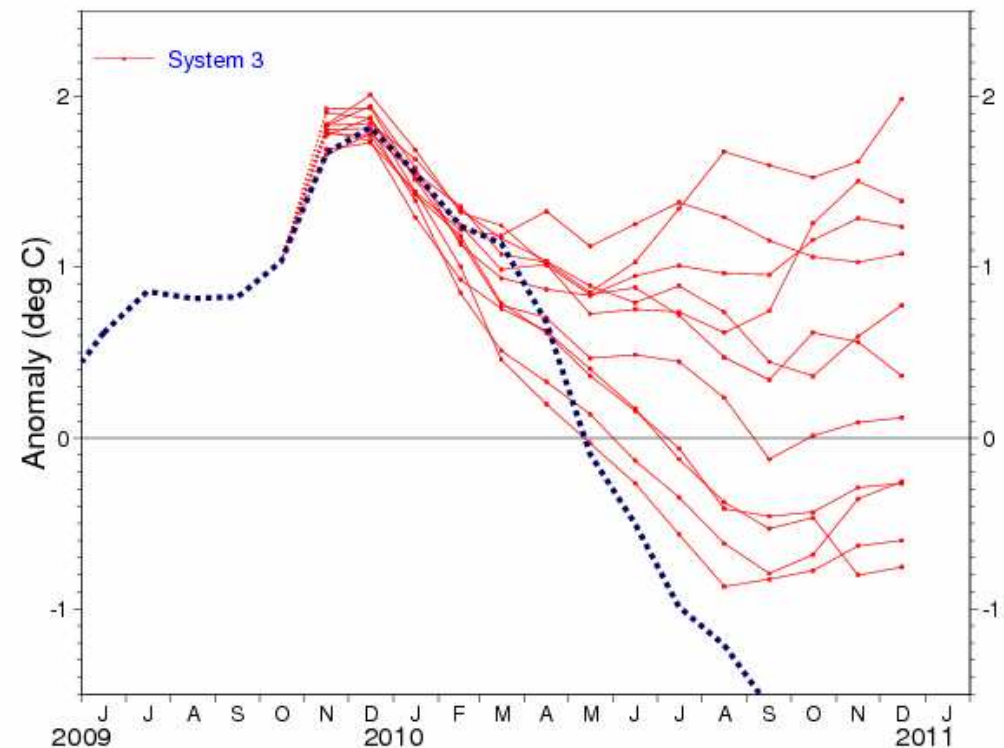
Annual predictions: examples

System 3 annual Niño3.4 sea surface temperature forecasts (red lines) and observations (blue line).

**Nov 2008
start date**



**Nov 2009
start date**



Annual predictions: ENSO

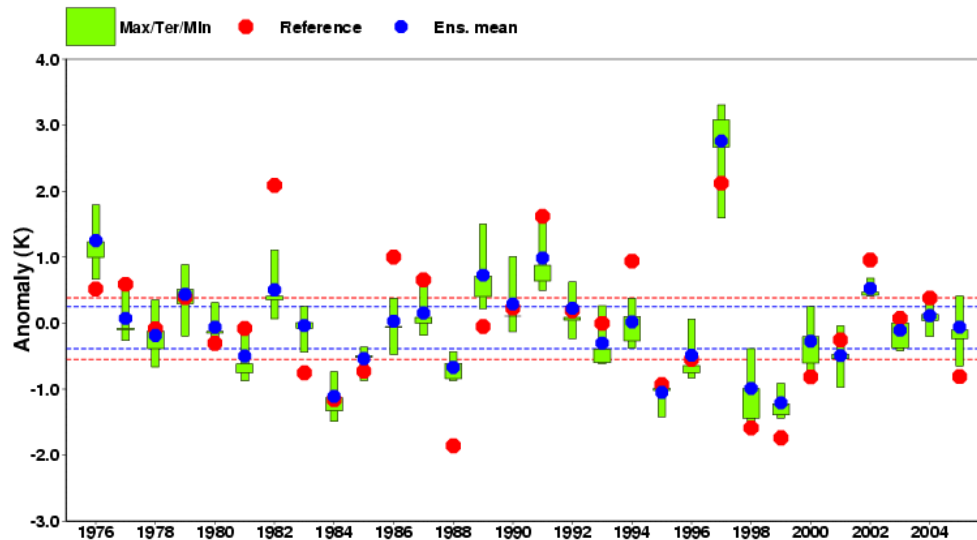
Niño3.4 time series for ERA40/Int (red dots), five-member ensemble (green box-and-whisker) and ensemble mean (blue dots) 8-10 month (DJF) re-forecasts over 1976-2005.

EC-Earth

Ratio sd: 0.83

Corr: 0.80

RPSSd: 0.55

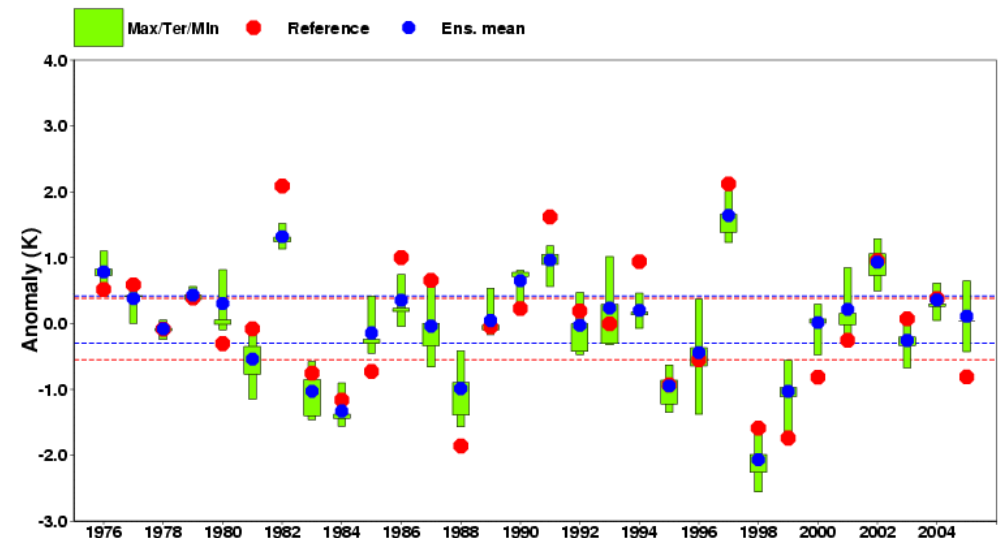


System 3

Ratio sd: 0.84

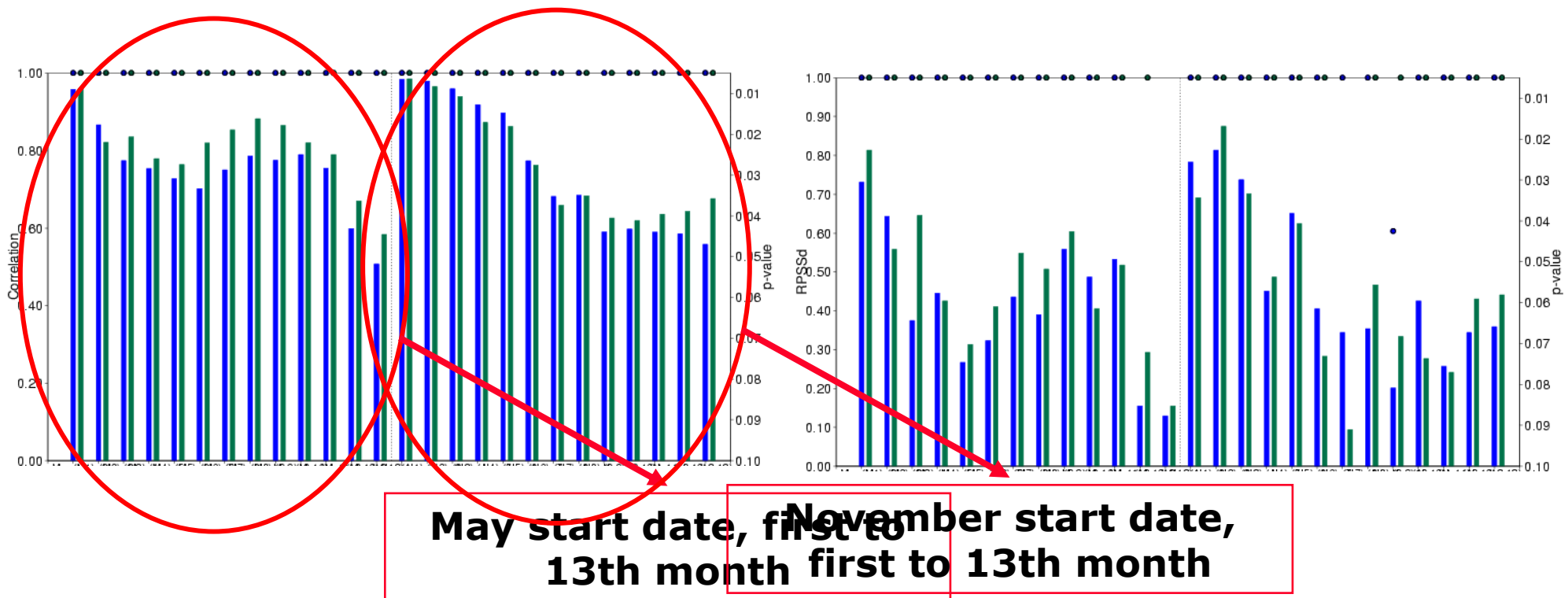
Corr: 0.87

RPSSd: 0.56



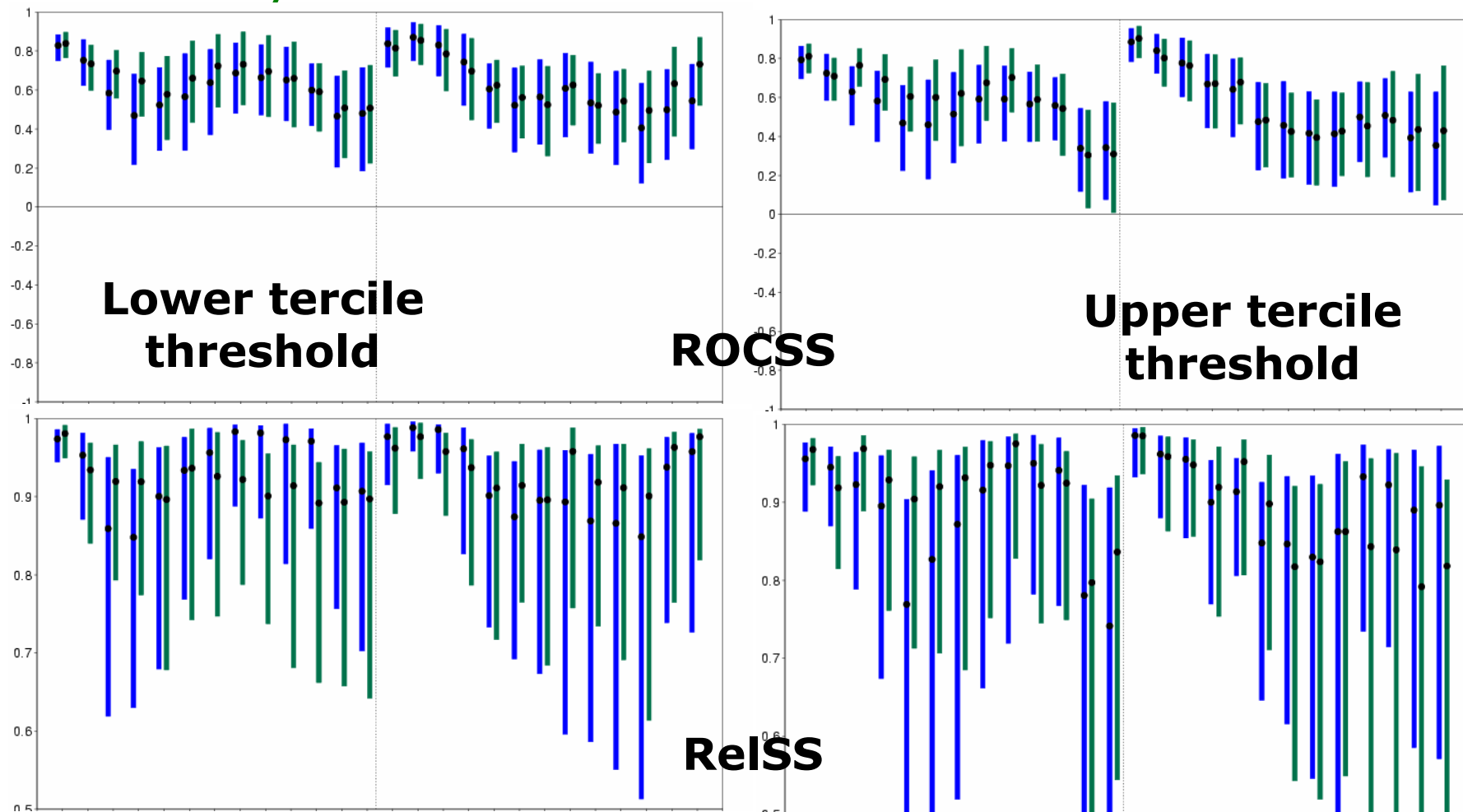
Annual predictions: ENSO

Niño3.4 ensemble-mean correlation (left) and debiased RPSS (right) for **EC-Earth** and **System 3** five-member ensemble re-forecasts with May and November start dates over 1976-2005.



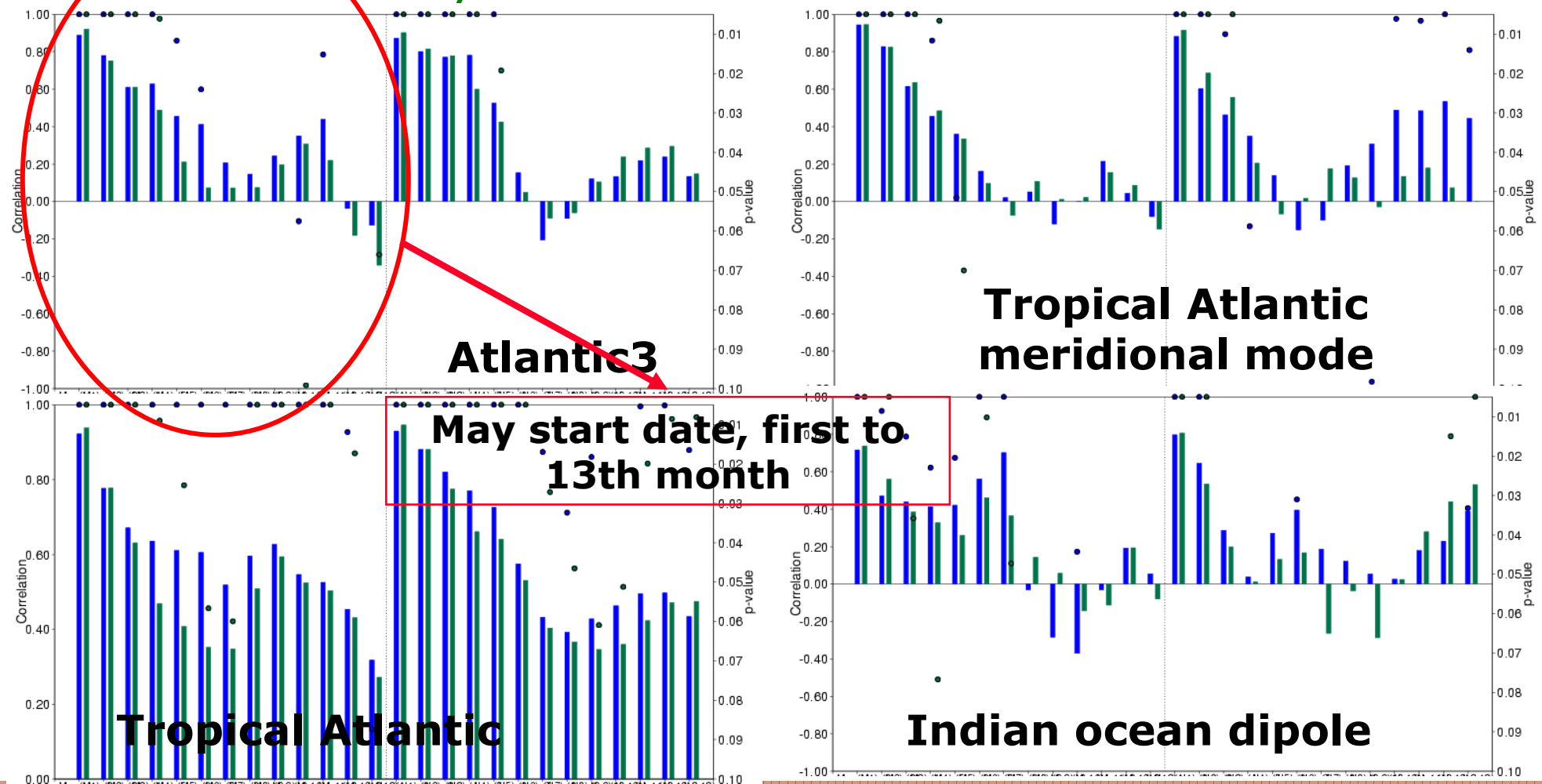
Annual predictions: ENSO

Niño3.4 probabilistic scores (and 95% conf. intervals) for **EC-Earth** and **System 3** ensemble re-forecasts over 1976-2005.



Annual predictions: other tropical oceans

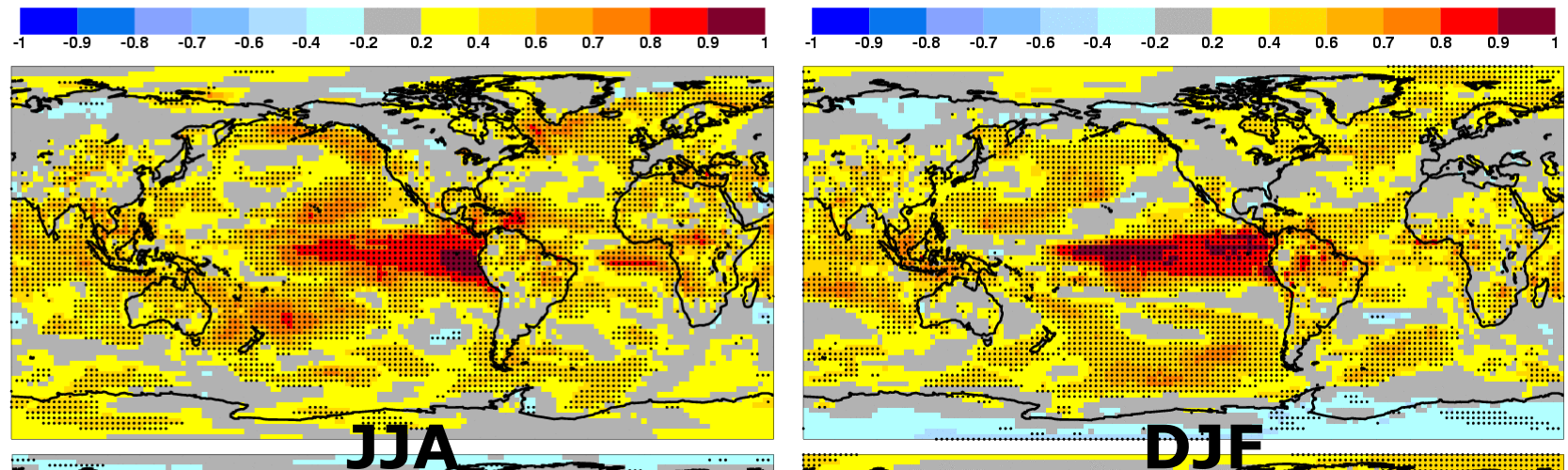
Ensemble-mean correlation of different SST indices for **EC-Earth** and **System 3** re-forecasts over 1976-2005.



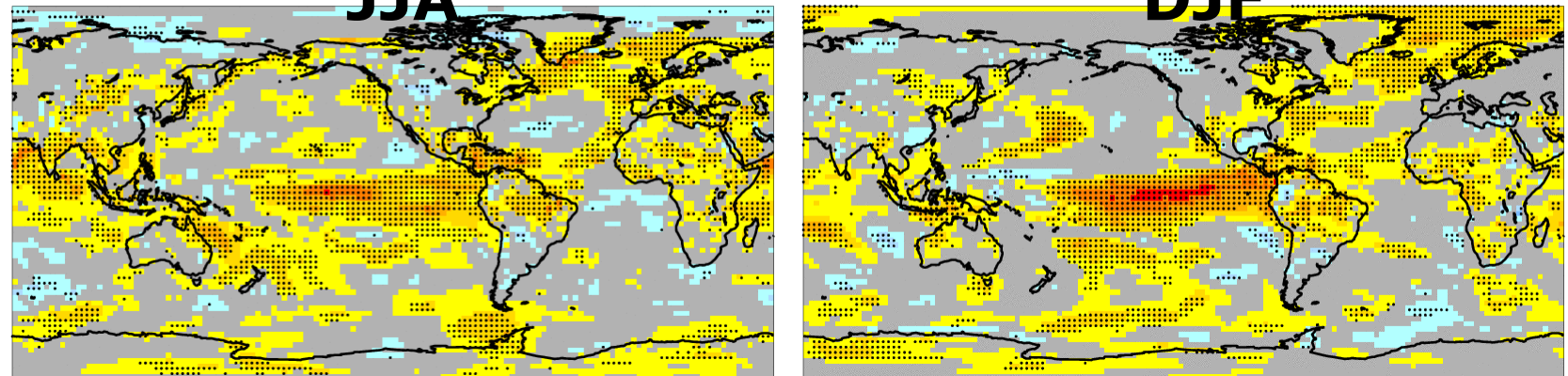
Annual predictions: lead time effect

Ensemble-mean correlation of EC-Earth near-surface air temperature re-forecasts wrt ERA40/Int over 1976-2005.
Dots for values statistically significant with 95% conf.

**1-month
lead time**

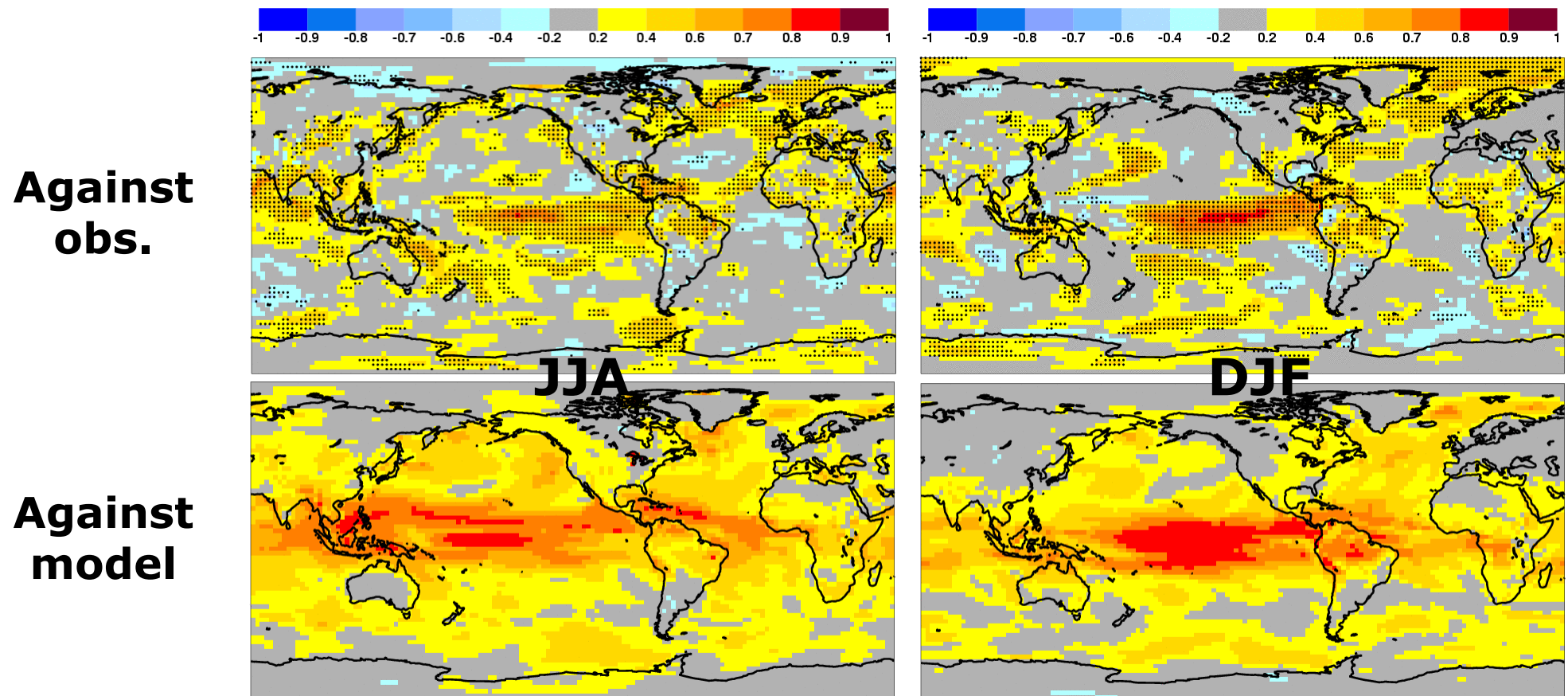


**7-month
lead time**



Annual predictions: predictability

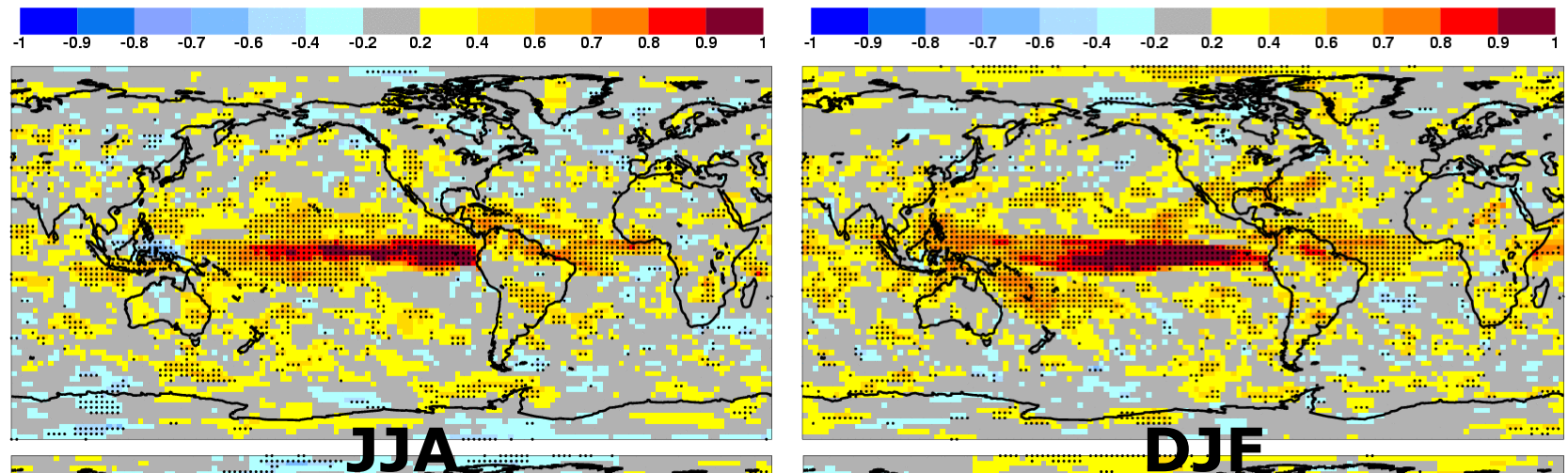
Ensemble-mean correlation of EC-Earth 8-10 month near-surface air temperature re-forecasts over 1976-2005. Dots for values statistically significant with 95% conf.



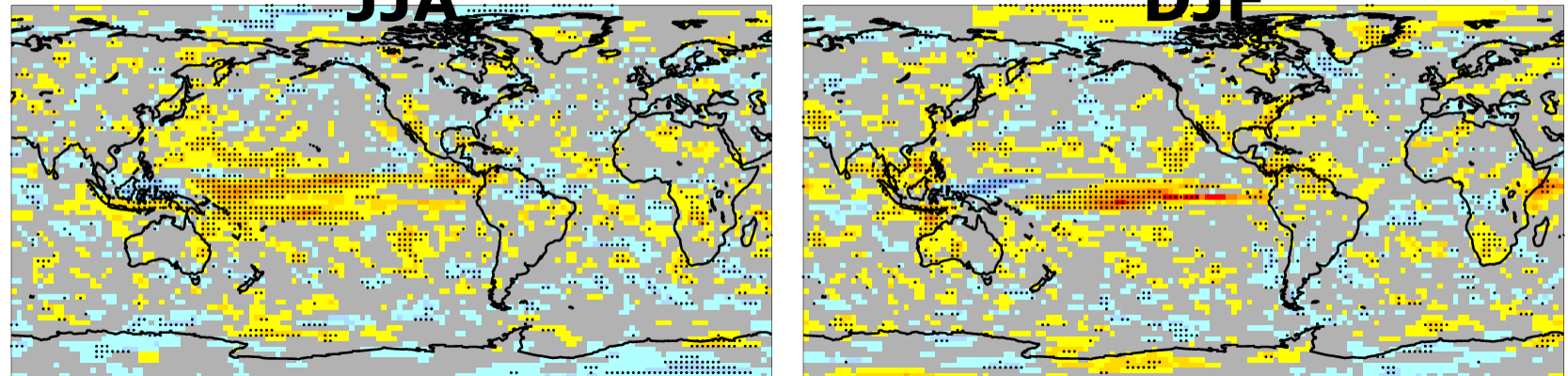
Annual predictions: lead time effect

Ensemble-mean correlation of EC-Earth precipitation re-forecasts wrt GPCP over 1980-2005. Dots for values statistically significant with 95% conf.

**1-month
lead time**

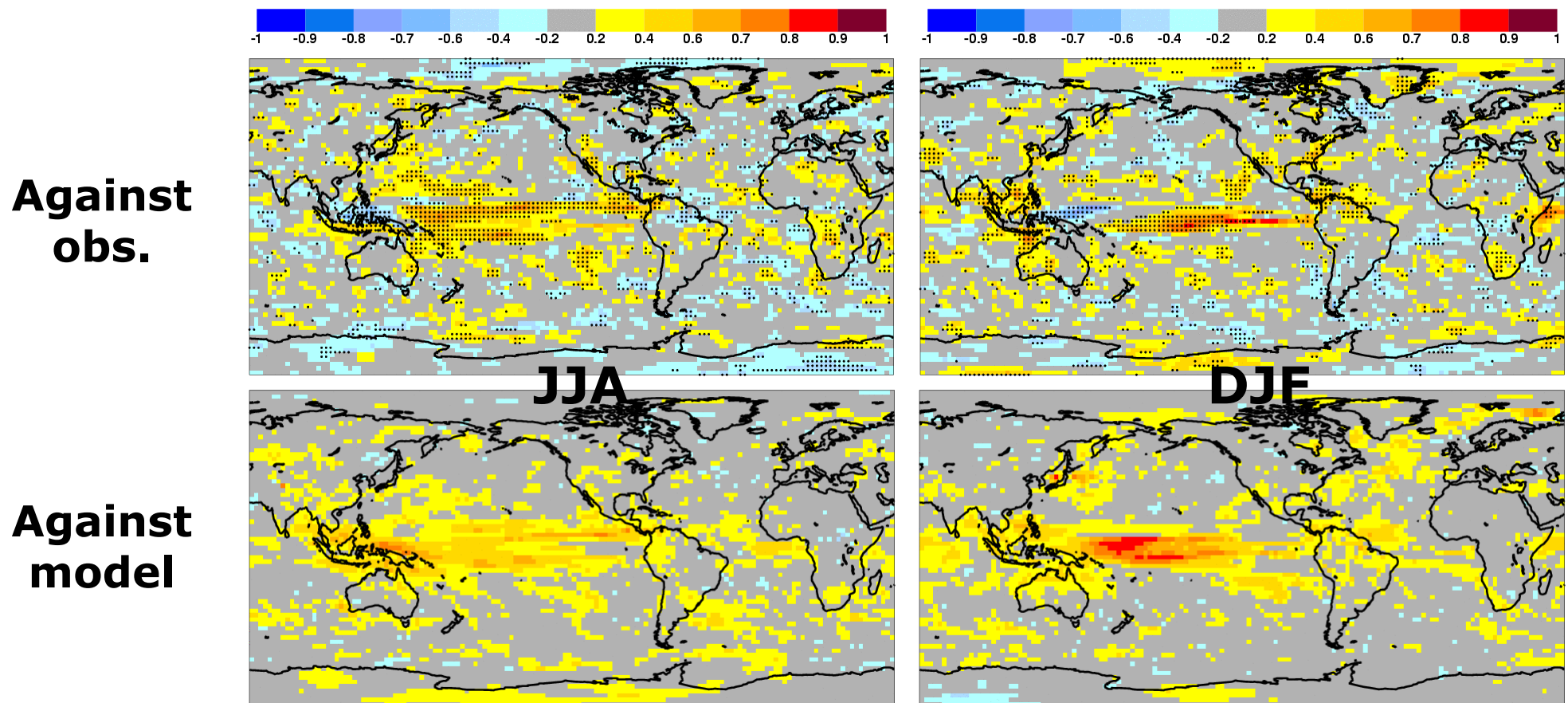


**7-month
lead time**



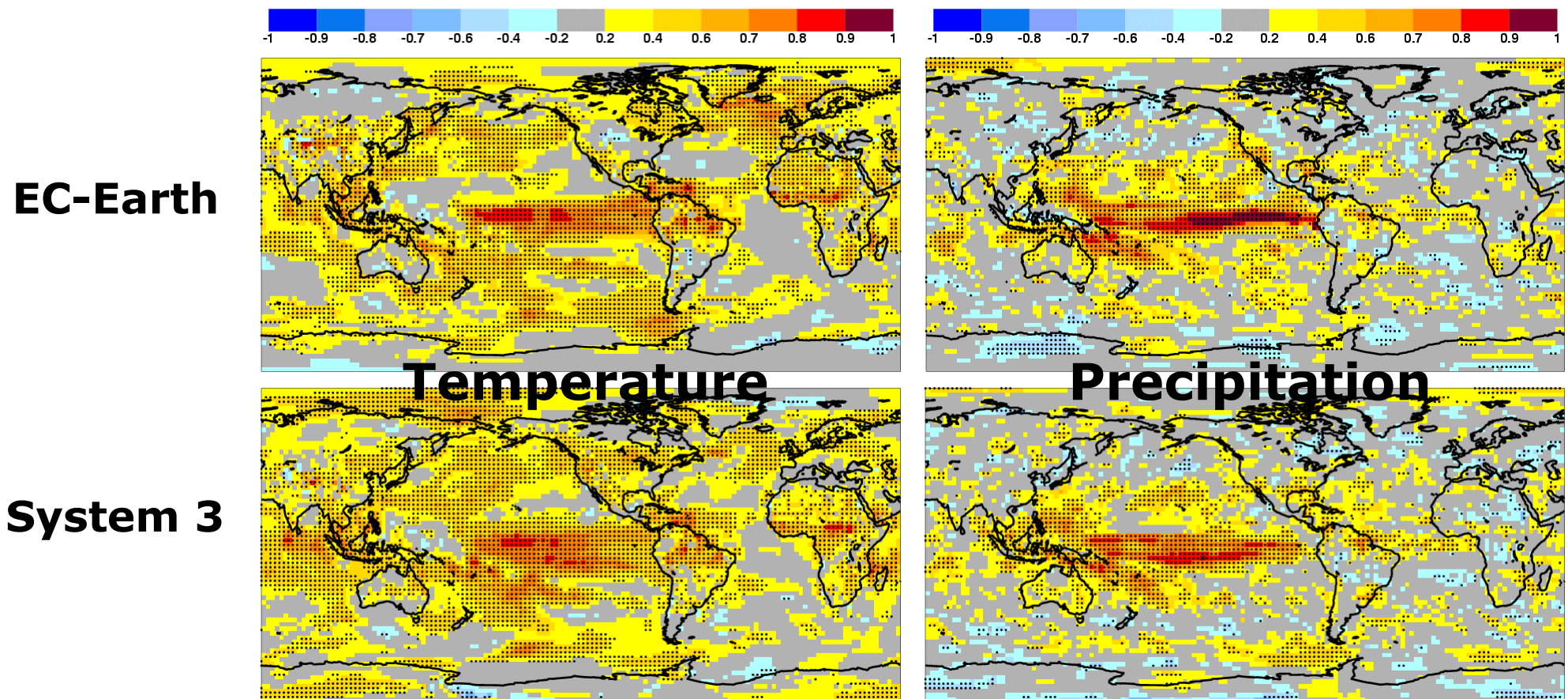
Annual predictions: predictability

Ensemble-mean correlation of EC-Earth 8-10 month precipitation re-forecasts over 1980-2005. Dots for values statistically significant with 95% conf.



Annual predictions: annual mean

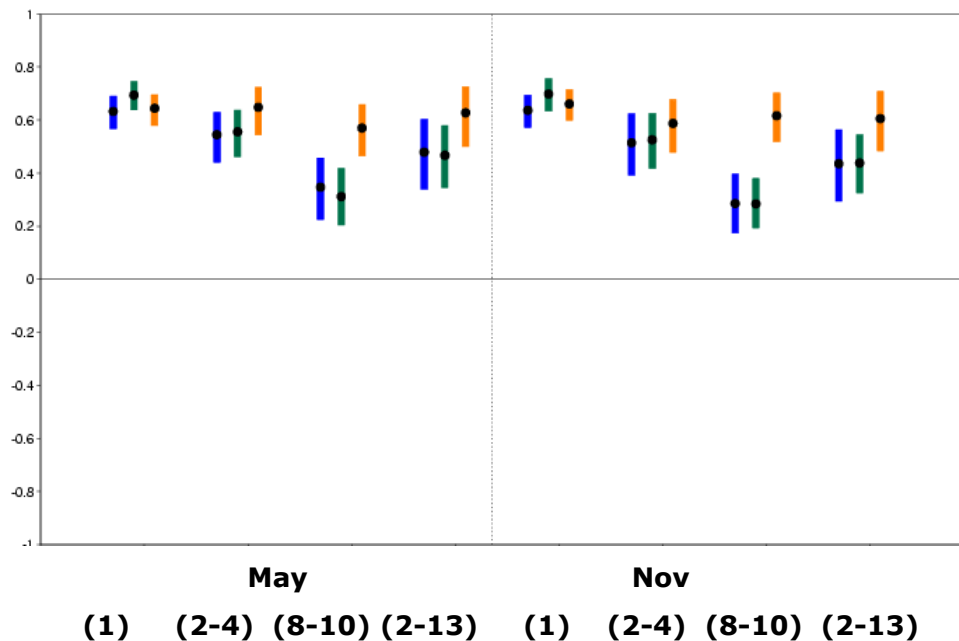
Ensemble-mean correlation of annual averages (months 2-13, Nov start) from re-forecasts (wrt ERA40/Int and GPCP) over 1976-2005. Dots for significant values with 95% conf.



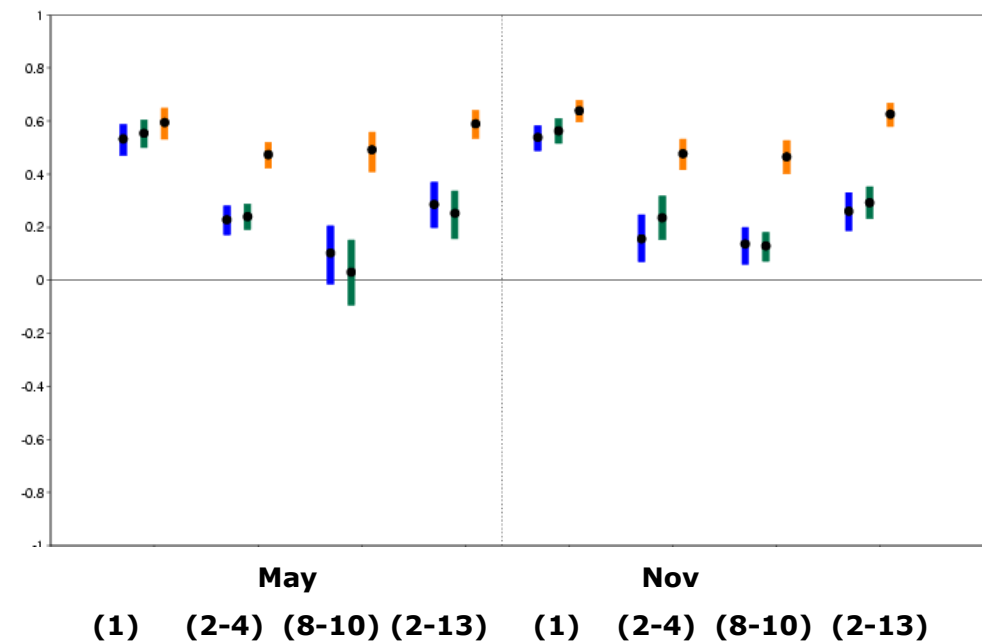
Annual predictions: regional skill

Anomaly correlation coefficient (and 95% confidence intervals) for **EC-Earth**, **System 3** and **EC-Earth/AMIP** five-member ensemble near-surface temperature re-forecasts wrt ERA40/Int over 1976-2005.

Tropics



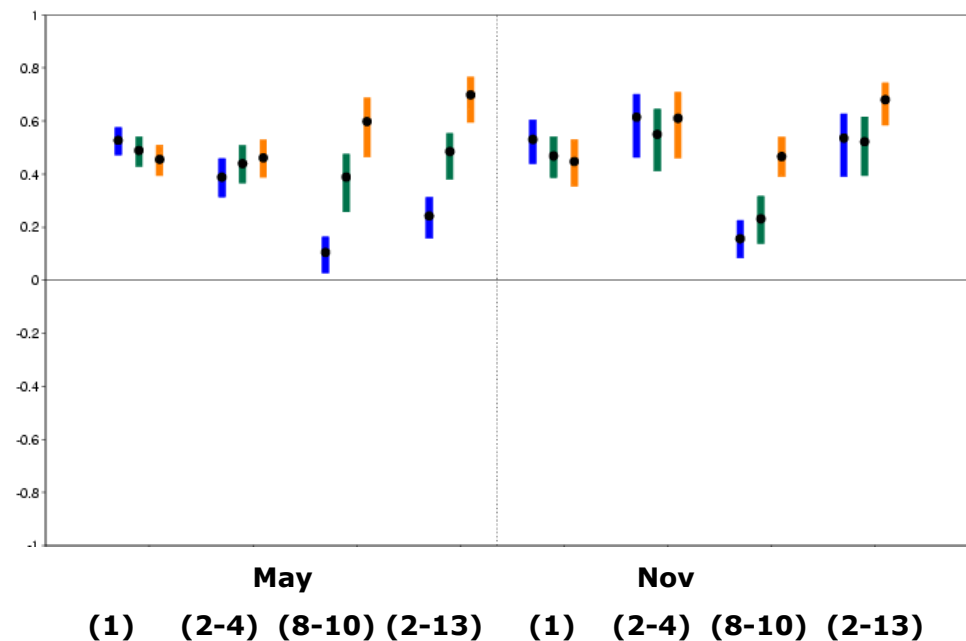
Northern Extratropics



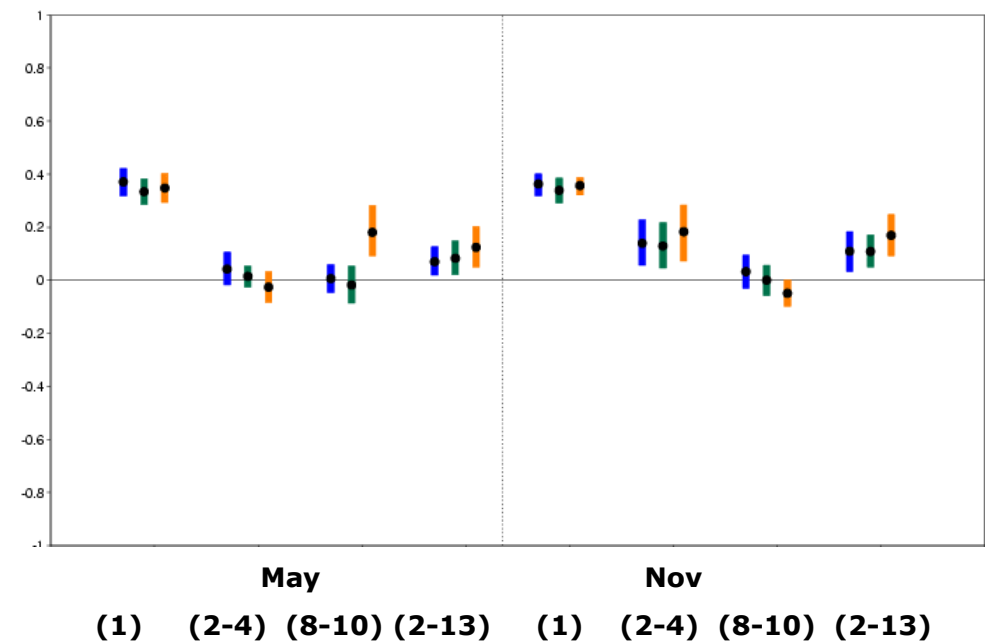
Annual predictions: regional skill

Anomaly correlation coefficient (and 95% confidence intervals) for **EC-Earth**, **System 3** and **EC-Earth/AMIP** five-member ensemble precipitation re-forecasts wrt GPCP over 1980-2005.

Tropics

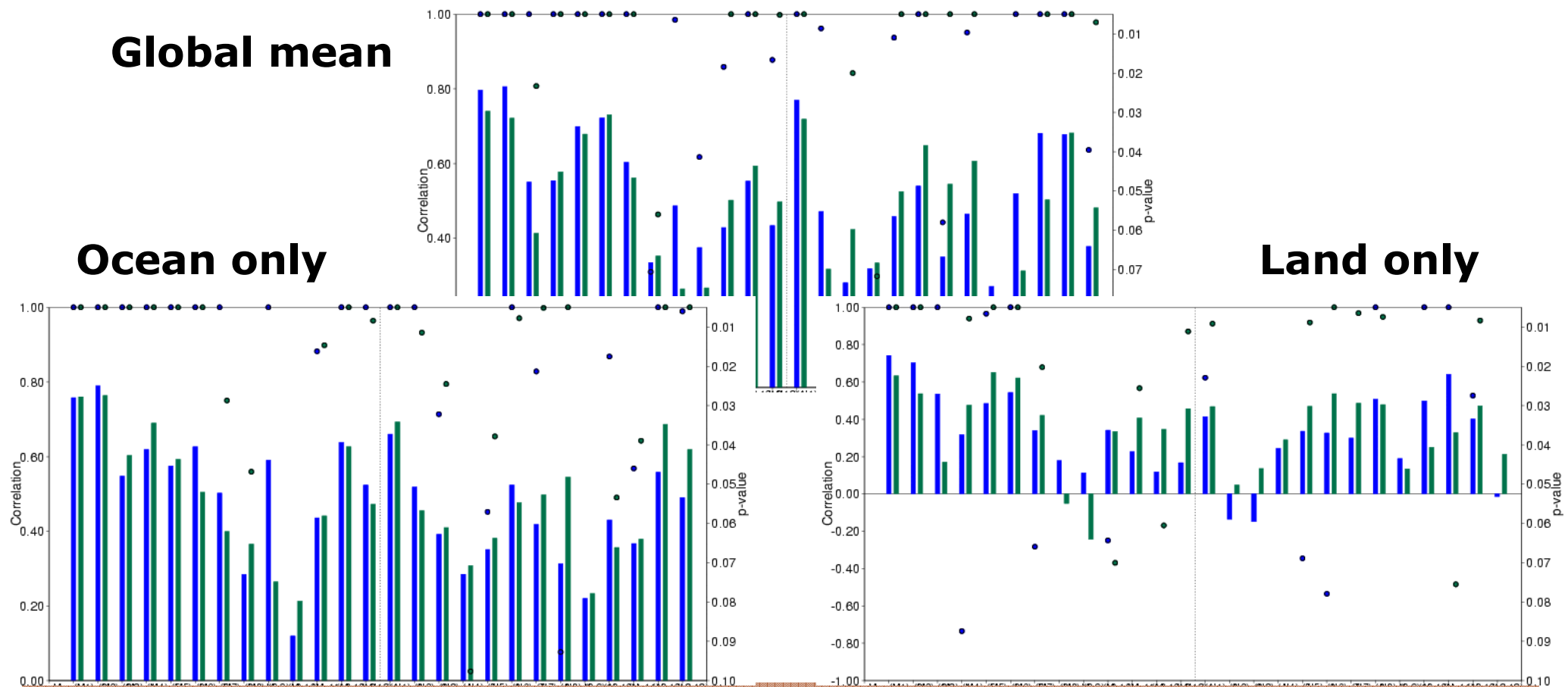


Northern Extratropics



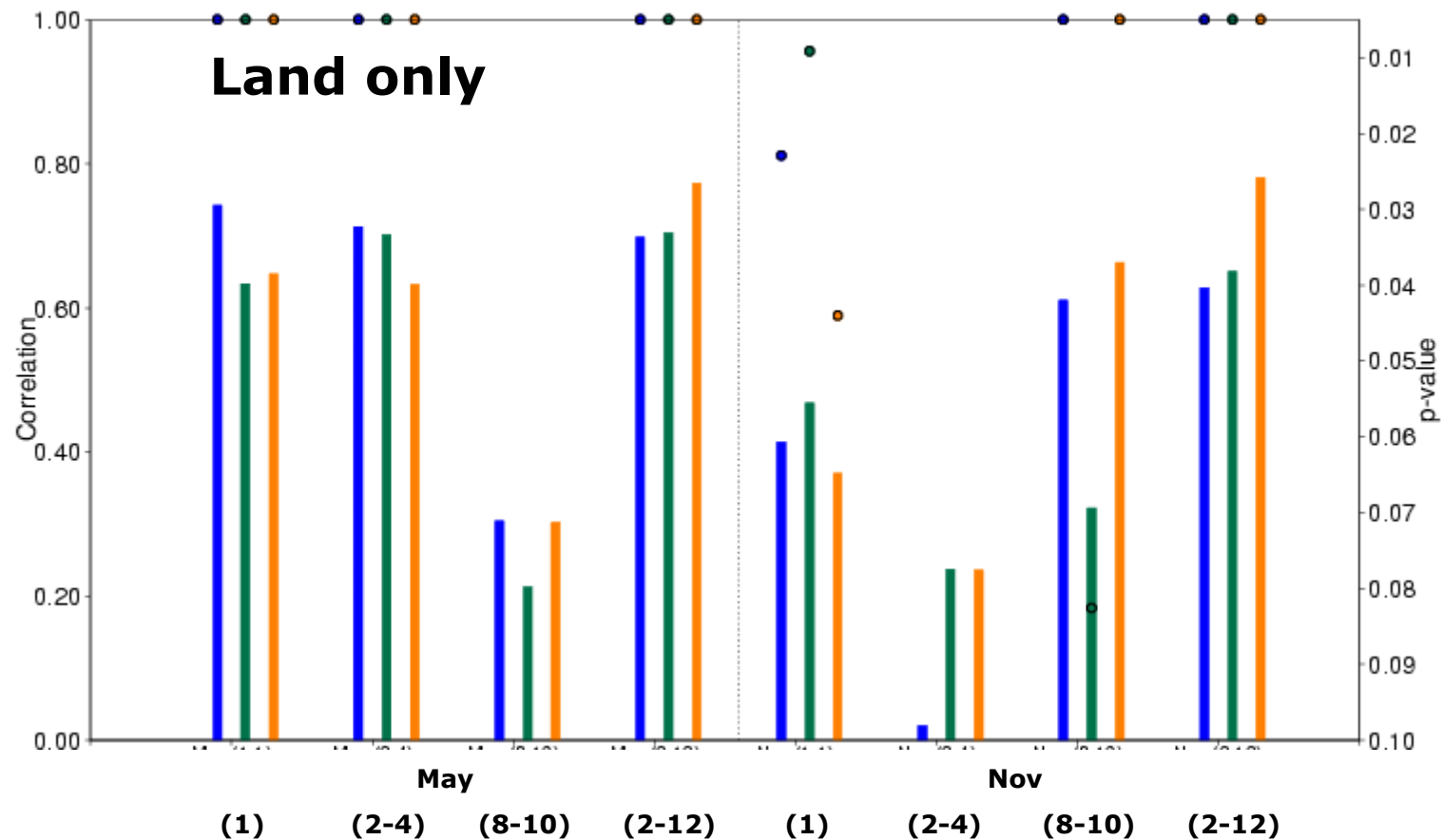
Annual predictions: global mean

Ensemble-mean correlation for **EC-Earth** and **System 3** five-member ensemble near-surface temperature re-forecasts wrt ERA40/Int over 1976-2005.



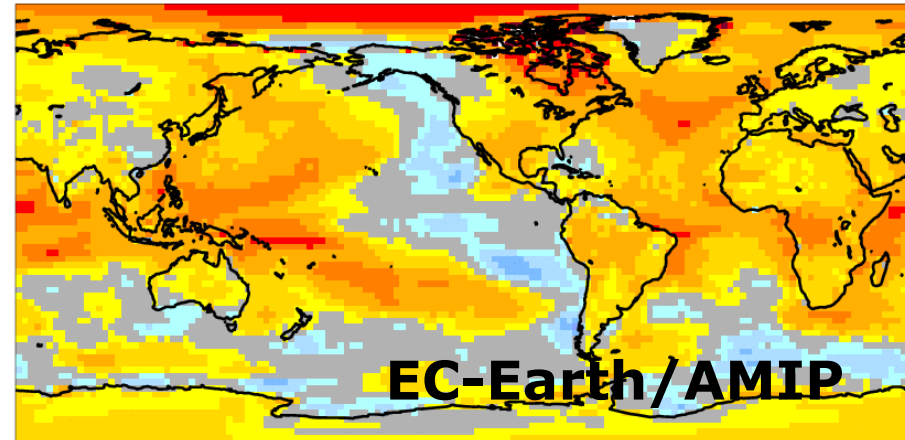
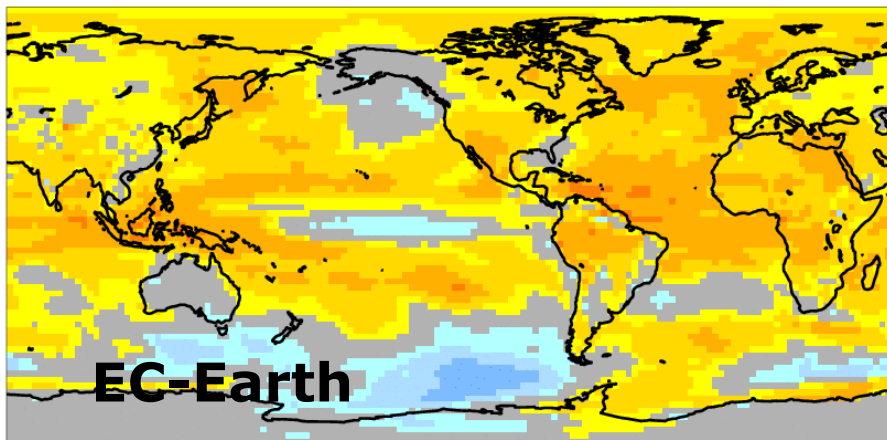
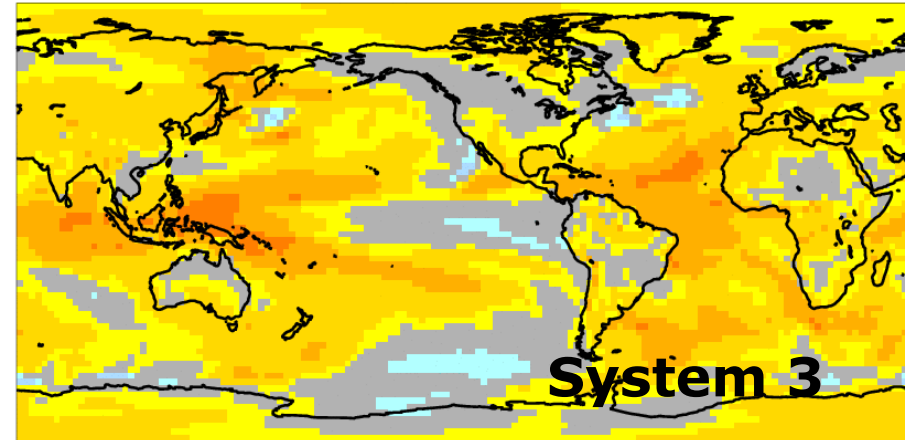
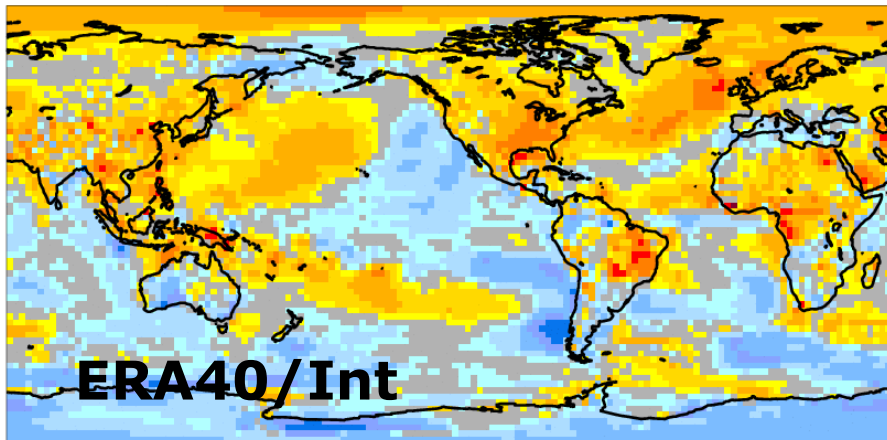
Annual predictions: Global mean

Ensemble-mean correlation for **EC-Earth**, **System 3** and **EC-Earth/AMIP** five-member ensemble near-surface temperature re-forecasts wrt ERA40/Int over 1976-2005.



Annual predictions: trends

Normalized trends of near-surface temperature 8-10 month (DJF) re-forecasts over 1976-2005.



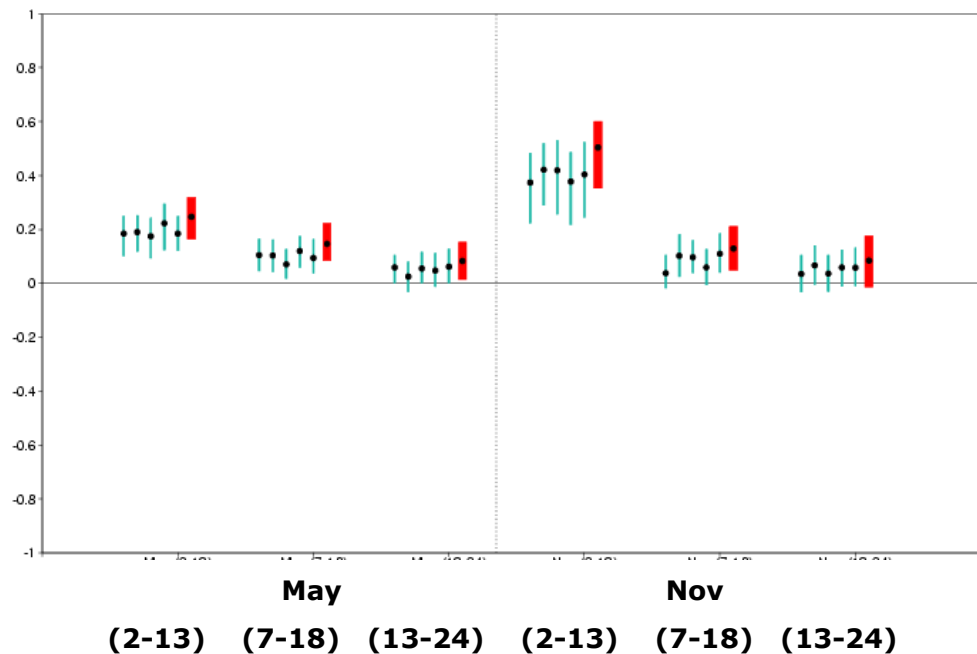
Multi-annual forecast experimental setup

- One forecast system: EC-Earth v2.2 (IFS/NEMO)
- Initial conditions: ERA40/ERAInt atmosphere and land, ORA-S3 and NEMOVAR-COMBINE ocean, DFS4.3 sea ice
- 1) Five-member ensemble hindcasts up to 24 months with two start dates per year (May and November) over 1976-2005 and 2) five-member ensemble hindcasts up to 120 months with one start date every five years over 1960-2005
- Ensemble from five-member ocean analysis and atmospheric perturbations (singular vectors) added to each member
- Initial conditions valid for 0 GMT on the 1st of a month

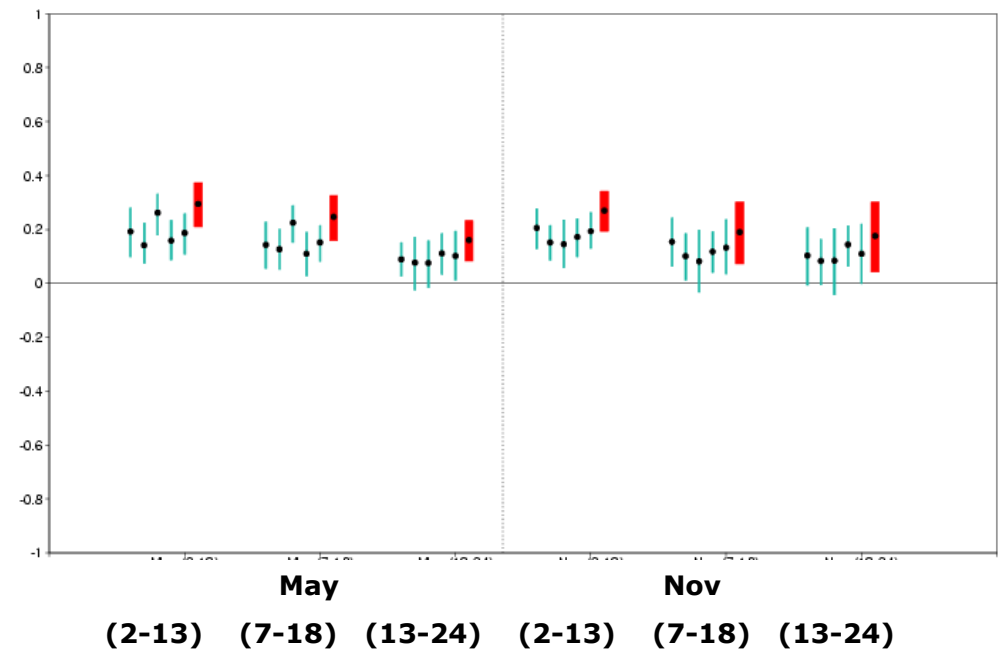
Interannual predictions: regional skill

Anomaly correlation coefficient (and 95% confidence intervals) for EC-Earth re-forecasts (**ensemble members** and **ensemble mean**) over 1975-2005.

Tropics precipitation



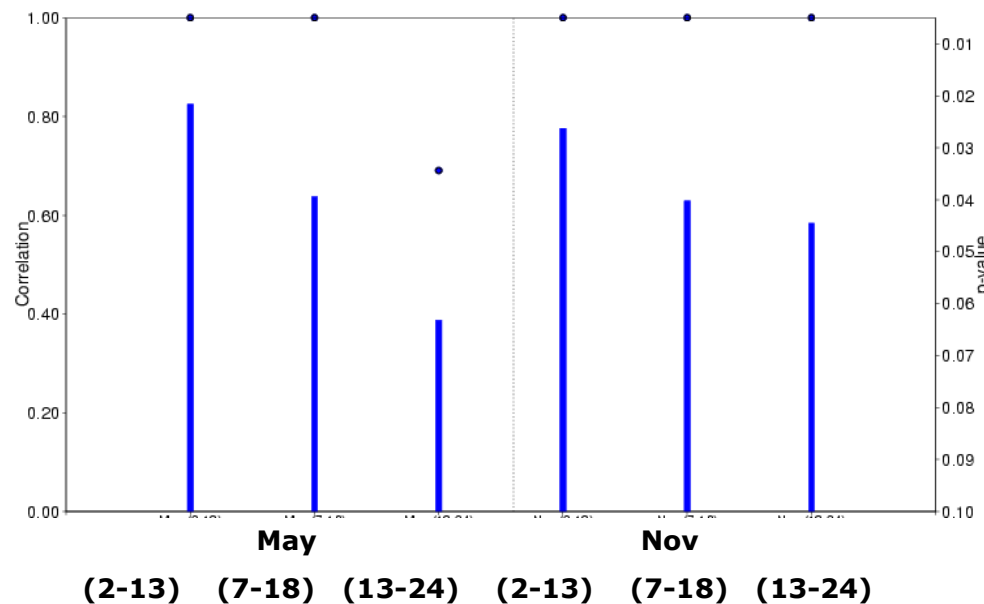
Northern Extratropics temperature



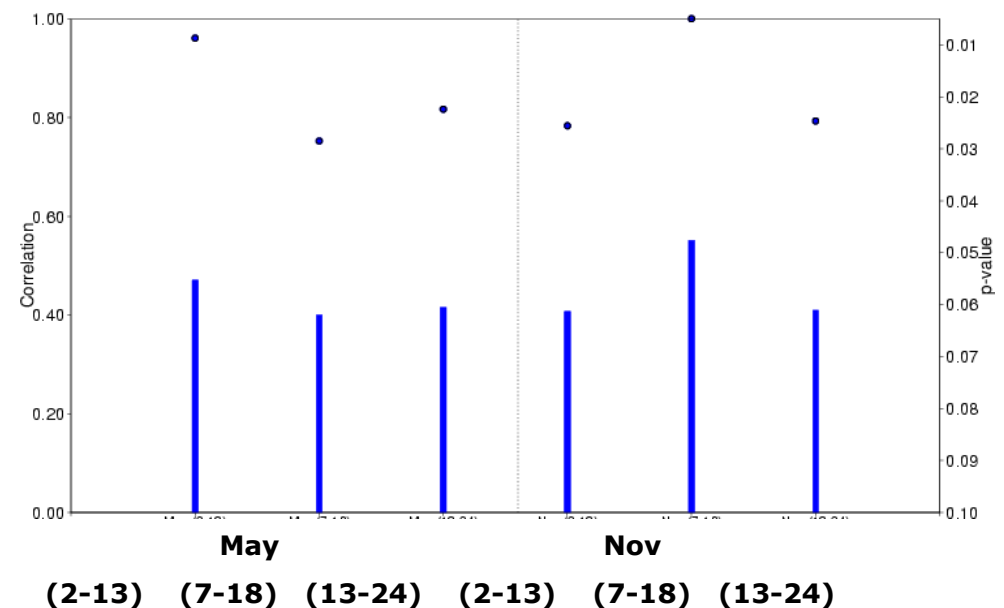
Interannual predictions: regional mean

Ensemble-mean correlation for EC-Earth five-member ensemble re-forecasts with May and November start dates over 1976-2005.

Niño3.4

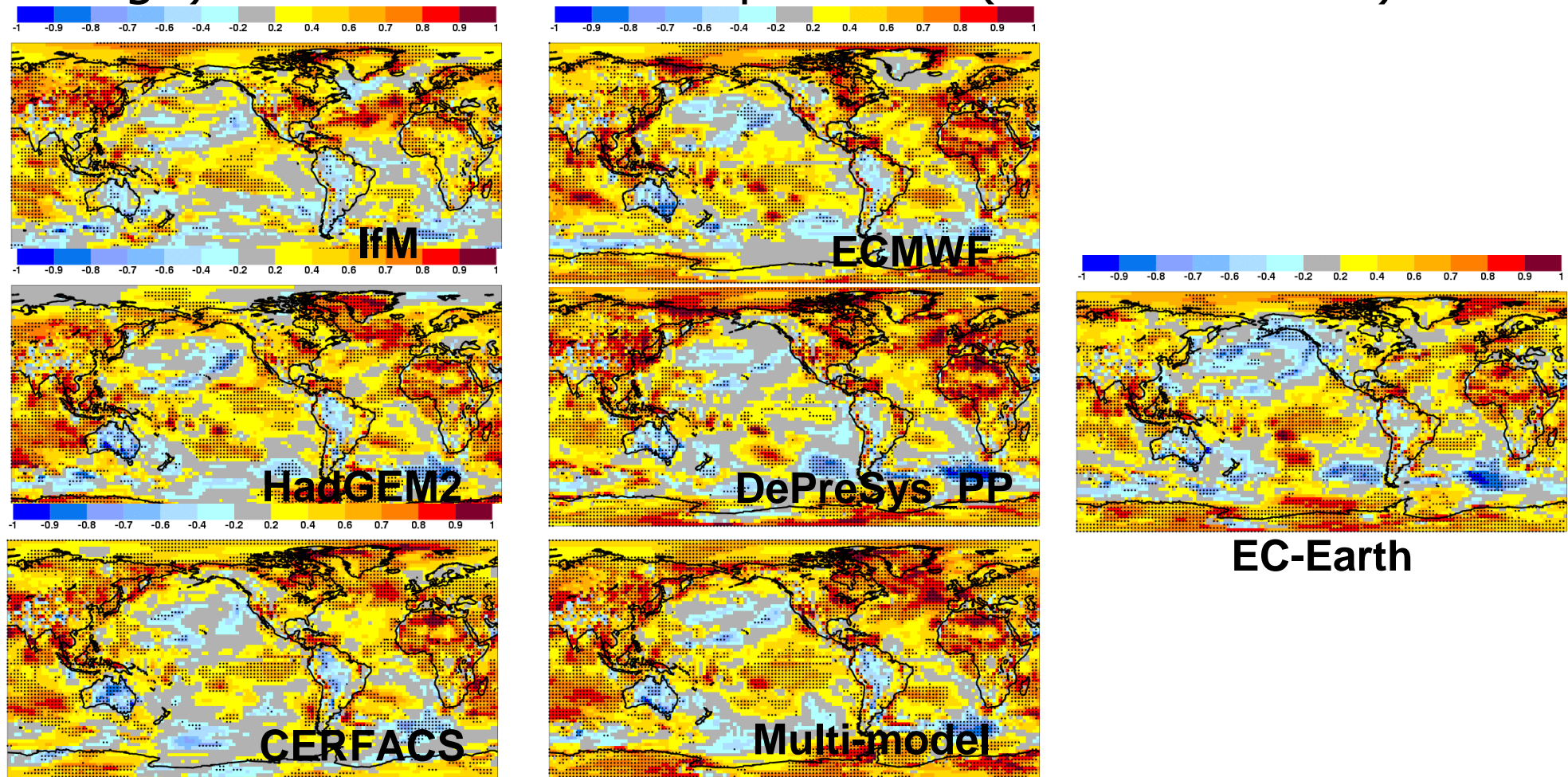


Southern Europe temperature



Interannual predictions: ensemble mean

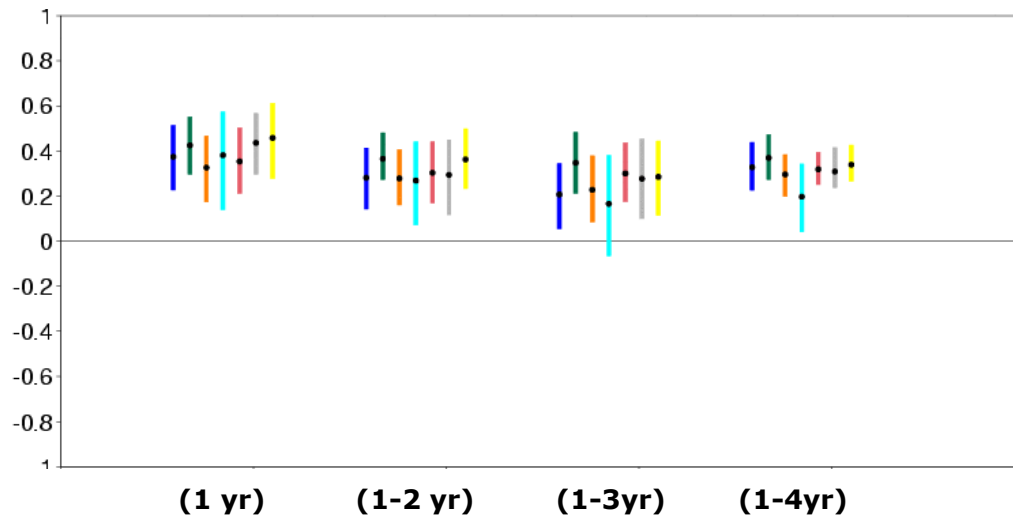
Ensemble-mean correlation for decadal forecasts (1-4 year average) of near-surface temperature (ten start dates)



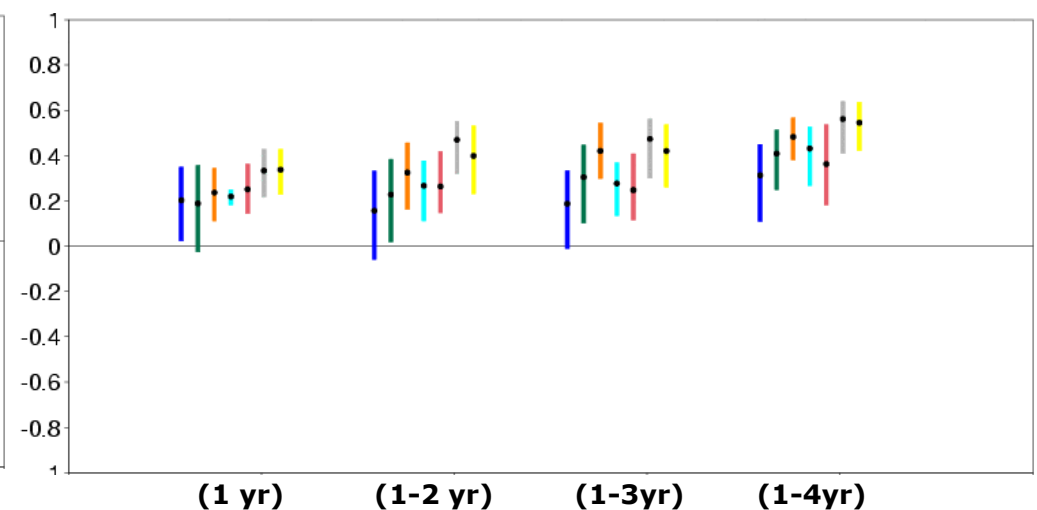
Interannual predictions: regional skill

Anomaly correlation coefficient (and 95% confidence intervals) for **EC-Earth** (5), **IFS/HOPE-35R3** (3), **CERFACS** (3), **IfM** (3), **HadGEM2** (3), **DePreSys_PP** (9) and **ENSEMBLES multi-model** (12) near-surface air temperature re-forecasts wrt ERA40/Int over 1960-2005.

Tropics



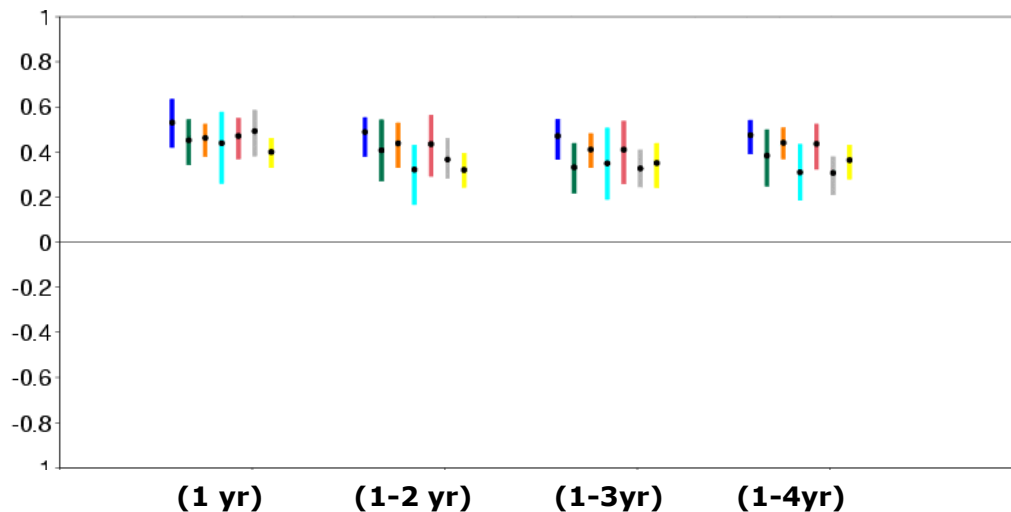
Northern Extratropics



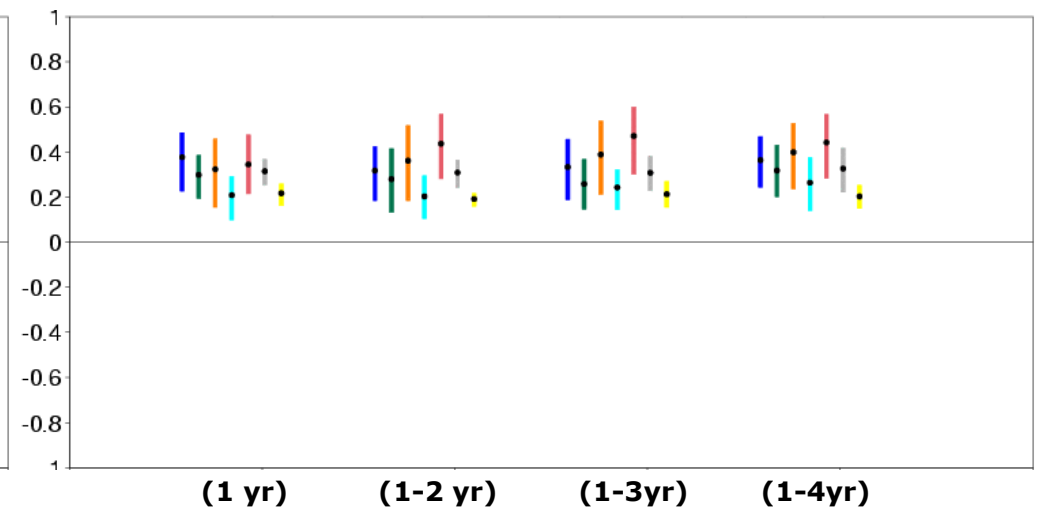
Interannual predictions: regional skill

Perfect-model anomaly correlation coefficient (and 95% confidence intervals) for **EC-Earth** (5), **IFS/HOPE-35R3** (3), **CERFACS** (3), **IfM** (3), **HadGEM2** (3), **DePreSys_PP** (9) and **ENSEMBLES multi-model** (12) near-surface air temperature re-forecasts wrt ERA40/Int over 1960-2005.

Tropics



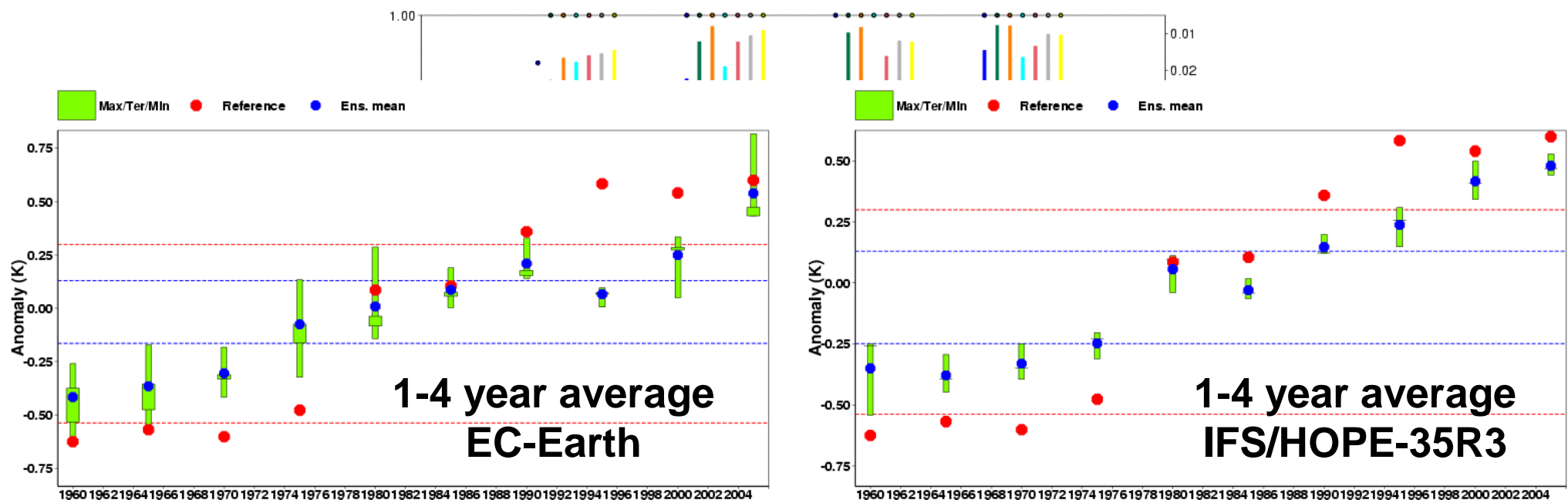
Northern Extratropics



Interannual predictions: regional mean

Ensemble-mean correlation (and p value, right-hand side scale) for **EC-Earth** (5), **IFS/HOPE-35R3** (3), **CERFACS** (3), **IfM** (3), **HadGEM2** (3), DePreSys_PP (9) and **ENSEMBLES multi-model** (12) near-surface air temperature re-forecasts wrt ERA40/Int over 1960-2005.

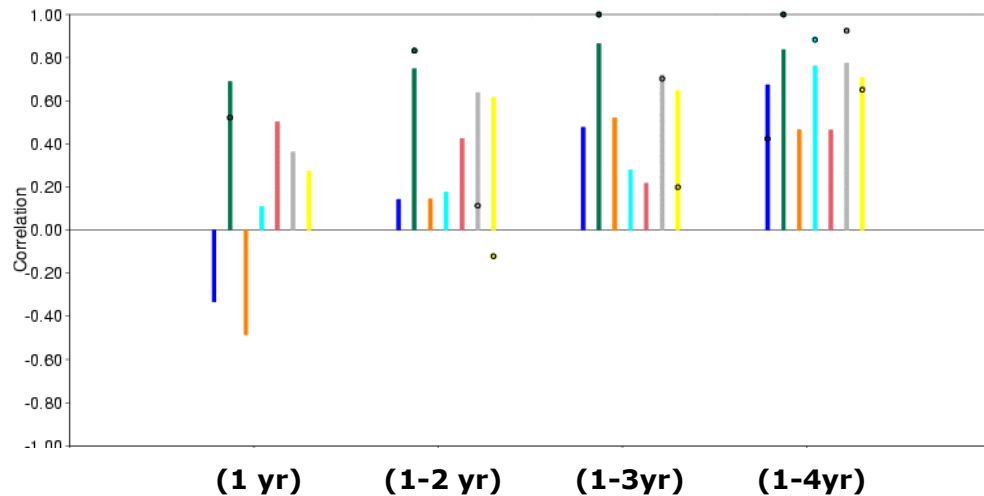
Land-temperature



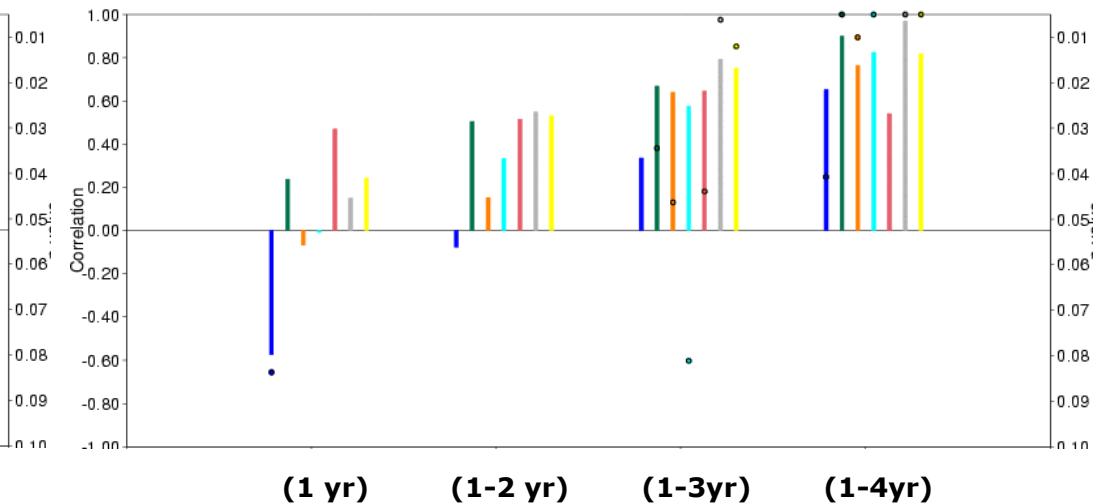
Interannual predictions: regional mean

Ensemble-mean correlation (and p value, right-hand side scale) for **EC-Earth** (5), **IFS/HOPE-35R3** (3), **CERFACS** (3), **IfM** (3), **HadGEM2** (3), **DePreSys_PP** (9) and **ENSEMBLES multi-model** (12) near-surface air temperature re-forecasts wrt ERA40/Int over 1960-2005.

Northern Europe



Southern Europe



Some thoughts

- Substantial systematic error, including lack of reliability, is still a fundamental problem in dynamical forecasting and forces *a posteriori* corrections. Forecast calibration such as forecast assimilation is still needed.
- There is statistically significant skill in ENSO and other tropical SSTs beyond the first few months of the forecasts.
- The skill at the interannual time scale is linked to the correct prediction of ENSO and global warming.
- Some problems are found in EC-Earth with land warming.
- The impact of many more processes remains to be analyzed: sea ice, anthropogenic aerosols, ...
- The seamless has still to be developed further.